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Kognitivna znanost
Cognitive Science

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Anka Slava Ozimič, Borut Trpin, Toma Strle

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Uredniki:

Anka Slana Ozimič
Filozofska fakulteta, Univerza v Ljubljani

Toma Strle
Pedagoška fakulteta, Univerza v Ljubljani

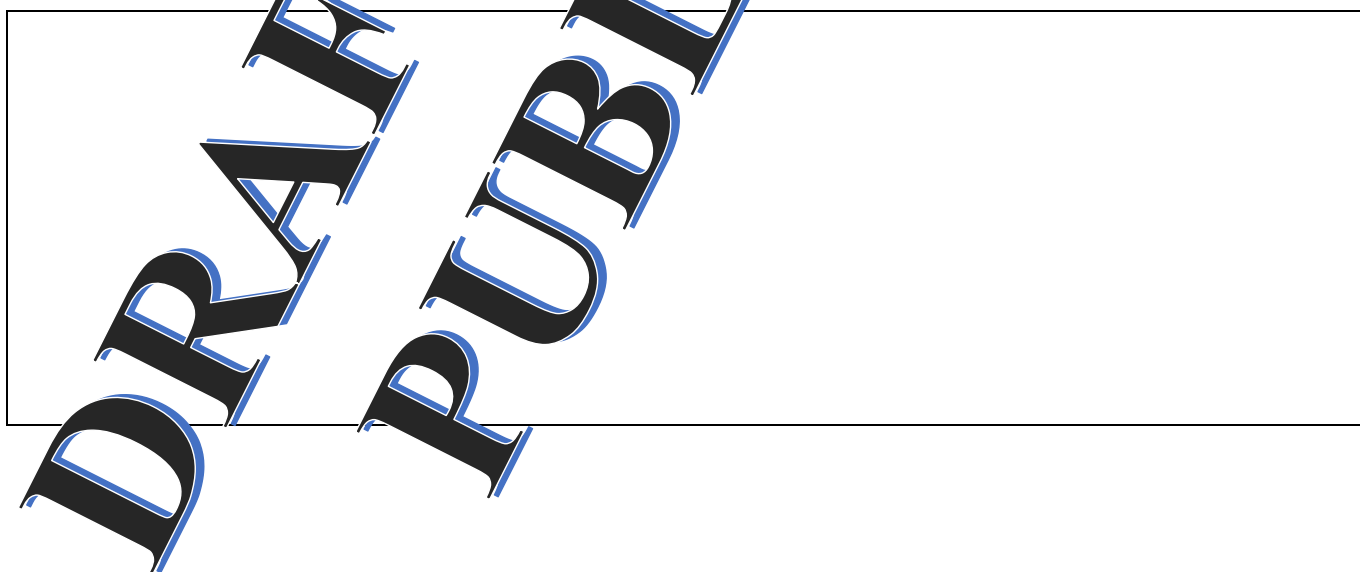
Borut Trpin
Filozofska fakulteta, Univerza v Ljubljani

Založnik: Institut »Jožef Stefan«, Ljubljana
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PREDGOVOR MULTIKONFERENCI INFORMACIJSKA DRUŽBA 2026

29. mednarodna multikonferenca *Informacijska družba* se odvija v času izjemne rasti umetne inteligence, njenih aplikacij in vplivov na človeštvo. Vsako leto bolj vstopamo v novo dobo, v kateri generativna umetna inteligenca ter drugi inovativni pristopi oblikujejo poti k superinteligenci in singularnosti, ki bosta krojili prihodnost človeške civilizacije. Naša konferenca je tako hkrati tradicionalna znanstvena in akademsko odprta, pa tudi inkubator novih, pogumnih idej in pogledov.

Letošnja konferenca poleg umetne inteligence vključuje tudi razprave o perečih temah današnjega časa: ohranjanje okolja, demografski izzivi, zdravstvo in preobrazba družbenih struktur. Razvoj UI ponuja rešitve za številne sodobne izzive, kar poudarja pomen sodelovanja med raziskovalci, strokovnjaki in odločevalci pri oblikovanju trajnostnih strategij. Zavedamo se, da živimo v obdobju velikih sprememb, ko je ključno, da z inovativnimi pristopi in poglobljenim znanjem ustvarimo informacijsko družbo, ki bo varna, vključujoča in trajnostna.

V okviru multikonference smo letos združili dvanajst vsebinsko raznolikih srečanj, ki odražajo širino in globino informacijskih ved: od umetne inteligence v zdravstvu, demografskih in družinskih analiz, digitalne preobrazbe zdravstvene nege ter digitalne vključenosti v informacijski družbi, do raziskav na področju kognitivne znanosti, zdrave dolgoživosti ter vzgoje in izobraževanja v informacijski družbi. Pridružujejo se konference o legendah računalništva in informatike, prenosu tehnologij, mitih in resnicah o varovanju okolja, odkrivanju znanja in podatkovnih skladiščih ter seveda Slovenska konferenca o umetni inteligenci.

Poleg referatov bodo okrogle mize in delavnice omogočile poglobljeno izmenjavo mnenj, ki bo pomembno prispevala k oblikovanju prihodnje informacijske družbe. »Legende računalništva in informatike« predstavljajo domači »Hall of Fame« za izjemne posameznike s tega področja. Še naprej bomo spodbujali raziskovanje in razvoj, odličnost in sodelovanje; razširjeni referati bodo objavljeni v reviji *Informatica*, s podporo dolgoletne tradicije in v sodelovanju z akademskimi institucijami ter strokovnimi združenji, kot so ACM Slovenija, SLAIS, Slovensko društvo Informatika in Inženirska akademija Slovenije.

Vsako leto izberemo najbolj izstopajoče dosežke. Letos je nagrado *Michie-Turing* za izjemen življenjski prispevek k razvoju in promociji informacijske družbe prejel **Denis Trček**, priznanje za raziskovalni dosežek leta pa **Jure Leskovec**. »Informacijsko limono« za najmanj primerno informacijsko storitev je prejel informacijski sistem za dolgotrajno oskrbo. »Informacijsko jagodo« za najboljši sistem ali storitev v letih 2025/2026 pa je prejela elektronska osebna izkaznica. Iskrene čestitke vsem nagrajencem!

Naša vizija ostaja jasna: prepoznati, izkoristiti in oblikovati priložnosti, ki jih prinaša digitalna preobrazba, ter ustvariti informacijsko družbo, ki koristi vsem njenim članom. Vsem sodelujočim se zahvaljujemo za njihov prispevek — veseli nas, da bomo skupaj oblikovali dosežke, ki bodo krojili usodo Slovenije in sveta.

Mojca Ciglarič, predsednica programskega odbora
Matjaž Gams, predsednik organizacijskega odbora

FOREWORD TO THE MULTICONFERENCE INFORMATION SOCIETY 2026

The 29th International Multiconference *Information Society* takes place at a time of remarkable growth in artificial intelligence, its applications, and its impact on humanity. Each year we move further into a new era in which generative artificial intelligence and other innovative approaches are opening paths toward superintelligence and the singularity — two developments that will shape the future of human civilization. Our conference is at once a traditional scientific meeting, an academically open forum, and an incubator of new and bold ideas.

In addition to artificial intelligence, this year's conference also addresses pressing issues of our time: environmental protection, demographic challenges, healthcare, and the transformation of social structures. The development of AI offers solutions to many contemporary challenges and underscores the need for collaboration among researchers, professionals, and policymakers in shaping sustainable strategies. We are aware that we live in a period of profound change, when innovative approaches and deep knowledge are essential if we are to build an information society that is safe, inclusive, and sustainable.

This year's multiconference brings together twelve thematically diverse meetings that reflect the breadth and depth of the information sciences. They range from artificial intelligence in healthcare, demographic and family studies, the digital transformation of nursing, and digital inclusion in the information society, to research in cognitive science, healthy longevity, and education in the information society. They are joined by conferences on the Legends of Computing and Informatics, technology transfer, myths and truths of environmental protection, knowledge discovery and data warehouses, and, of course, the Slovenian Conference on Artificial Intelligence.

Alongside the papers, round tables and workshops will enable an in-depth exchange of views that will contribute substantially to shaping the future information society. *Legends of Computing and Informatics* serves as a national Hall of Fame for outstanding individuals in the field. We will continue to foster research and development, excellence, and collaboration. Extended papers will be published in the journal *Informatica*, building on a long-standing tradition and on cooperation with academic institutions and professional associations, including ACM Slovenia, SLAIS, the Slovenian Society Informatika, and the Slovenian Academy of Engineering.

Each year we single out the most distinctive achievements. This year the *Michie–Turing Award* for an outstanding lifetime contribution to the development and promotion of the information society was presented to **Denis Trček**, and the Award for Research Achievement of the Year to **Jure Leskovec**. The “Information Lemon” for the least appropriate information service went to the long-term care information system. The “Information Strawberry” for the best system or service in 2025/2026 went to the electronic identity card. Our warmest congratulations to all the award winners.

Our vision remains clear: to recognize, use, and shape the opportunities of digital transformation, and to create an information society that benefits all of its members. We thank all participants for their contributions. We look forward to shaping, together, achievements that will determine the fate of Slovenia and of the world.

Mojca Ciglarič, Chair of the Program Committee
Matjaž Gams, Chair of the Organizing Committee

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PREDGOVOR

Dobrodošli na letošnji konferenci Kognitivna znanost v okviru multikonference Informacijska družba. Konferenca tudi letos združuje raziskovalce in raziskovalke, ki jih povezuje zanimanje za kognitivne procese in njihovo umeščenost v širši naravni in družbeni kontekst. Kognitivna znanost je interdisciplinarno raziskovalno polje, ki povezuje filozofijo, psihologijo, nevroznanost, lingvistiko, računalništvo, umetno inteligenco in sorodne discipline. Prav na presečišču različnih pristopov nastajajo nova vprašanja, metode in rešitve, ki bogatijo razumevanje kognicije in odpirajo pot k inovativnim aplikacijam.

Tudi letošnji program odraža to raznolikost. Prispevki obravnavajo delovni spomin, čustva in socialno zaznavanje ter povezave med kognitivnimi in gibalnimi procesi. Nevroznanstvene raziskave te teme dopolnjujejo s preučevanjem možganske dinamike in razvojem pristopov k analizi signalov EEG. Družbene in utelešene razsežnosti kognicije se povezujejo z vprašanji duševnega zdravja, medosebnih odnosov ter doživljanja umetnosti in kulturne dediščine. Pomemben del programa je namenjen umetni inteligenci, zlasti odzivom velikih jezikovnih modelov na moralne dileme in socialne namige, zanesljivosti njihovih odgovorov ter vplivu umetne inteligence na znanost in izobraževanje. Prispevki odpirajo tudi vprašanja zavesti, kritičnega mišljenja in pravičnosti pri strojnem učenju. Tak nabor tem potrjuje, da kognitivna znanost v Sloveniji in širše ostaja živahno raziskovalno polje, ki se nenehno odpira novim izzivom.

Del programa je tudi okrogla miza o vlogi raziskovalca v dobi umetne inteligence. Ta tema odpira vprašanja o tem, kako uporaba umetne inteligence spreminja raziskovalno delo, kaj pomeni za samostojno presojo in odgovornost raziskovalcev ter kako vrednotiti znanje, pri nastajanju katerega sodelujejo umetni sistemi. S tem povezuje razpravo o novih raziskovalnih možnostih s premislekom o znanstveni zanesljivosti in odgovorni uporabi teh orodij.

Konferenca Kognitivna znanost 2026 ostaja prostor srečevanja in dialoga med raziskovalkami in raziskovalci različnih disciplin in generacij. Upamo, da bo tudi tokrat spodbudila plodno izmenjavo idej, oblikovanje novih sodelovanj ter skupno refleksijo o prihodnjih poteh raziskovanja kognicije.

Dobrodošli!

Predsedujoči,
Anka Slana Ozimič, Toma Strle, Borut Trpin

FOREWORD

Welcome to this year's Cognitive Science conference, held within the multiconference Information Society. Once again, the conference brings together researchers who share an interest in cognitive processes and their place within the broader natural and social context. Cognitive science is an interdisciplinary research field that integrates philosophy, psychology, neuroscience, linguistics, computer science, artificial intelligence, and related disciplines. It is precisely at the intersection of these diverse approaches that new questions, methods, and solutions emerge, enriching our understanding of cognition and opening the way to innovative applications.

This year's program reflects this diversity. Contributions address working memory, emotions, and social perception, as well as the interplay between cognitive and motor processes. Neuroscientific research complements these themes by investigating brain dynamics and developing approaches to EEG signal analysis. Social and embodied dimensions of cognition are explored in relation to mental health, interpersonal relationships, and the experience of art and cultural heritage. A substantial part of the program is devoted to artificial intelligence, particularly the responses of large language models to moral dilemmas and social cues, the reliability of their answers, and the impact of artificial intelligence on science and education. Contributions also examine questions of consciousness, critical thinking, and fairness in machine learning. Taken together, these contributions demonstrate that cognitive science in Slovenia and beyond remains a dynamic field of research, continuously opening itself to new challenges.

The program also includes a round table on the role of researchers in the age of artificial intelligence. This theme raises questions about how the use of artificial intelligence changes research practice, what it means for researchers' independent judgement and responsibility, and how to evaluate knowledge produced with the involvement of artificial systems. It thus connects discussion of new research possibilities with reflection on scientific reliability and the responsible use of these tools.

The Cognitive Science 2026 conference continues to serve as a venue for encounters and dialogue among researchers from different disciplines and generations. We hope that this year's meeting will once again stimulate fruitful exchanges of ideas, foster new collaborations, and inspire collective reflection on the future directions of cognitive science.

Welcome!

Conference Co-Chairs,
Anka Slana Ozimič, Toma Strle, Borut Trpin

PROGRAMSKI ODBOR / PROGRAMME COMMITTEE

Anka Slana Ozimič, Filozofska fakulteta, Univerza v Ljubljani

Toma Strle, Pedagoška fakulteta, Univerza v Ljubljani

Borut Trpin, Filozofska fakulteta, Univerza v Ljubljani

Urška Martinc, Pedagoška fakulteta, Univerza v Ljubljani

Analiza kognitivnih zmogljivosti LLM: Etično odločanje velikih jezikovnih modelov pri problemu vozička

Evaluating LLM Cognitive Capabilities: Ethical Decision-Making of Large Language Models in the Trolley Problem

Marko Žakelj
Kognitivna znanost
Univerza v Novem mestu
Fakulteta za ekonomijo in informatiko
Slovenija
59257001@uni-nm.net

Matjaž Gams
Oddelek za inteligentne sisteme
Institut "Jožef Stefan"
Slovenija
matjaz.gams@ijs.si

Povzetek

Prispevek preučuje etično odločanje šestih velikih jezikovnih modelov (LLM) – Grok, ChatGPT, DeepSeek, Claude, Gemini in Mistral – v okviru problema vozička. Modeli so bili preizkušeni z istimi tremi scenariji (Switch, Loop, Footbridge), ki so jih pri 70.000 udeležencih iz 42 držav dokumentirali Awad in sod. [1]. Rezultati so primerjani z dvostranskim binomskim testom. Pri nobenem od treh scenarijev razlike niso statistično značilne (Switch: $p \approx 1,00$; Loop: $p \approx 0,67$; Footbridge: $p \approx 0,12$). Opisno razhajanje je najizrazitejše pri Footbridge (LLM: 16,7 % proti ljudje: 51 %). Majhen vzorec ($n = 6$) močno omejuje statistično moč. Ugotovitve kažejo, da modeli v posrednih scenarijih sledijo človeškim vzorcem, pri neposrednem fizičnem žrtvovanju pa so bolj zadržani, kar je verjetno posledica varnostnih mehanizmov RLHF.

Ključne besede

umetna inteligenca, veliki jezikovni modeli, moralna psihologija, problem vozička, kognitivna znanost

Študentski referat

Abstract

This paper examines the ethical decision-making of six large language models (LLMs) – Grok, ChatGPT, DeepSeek, Claude, Gemini, and Mistral – in the context of the Trolley Problem. The models were tested on the same three scenarios (Switch, Loop, Footbridge) previously administered to 70,000 participants across 42 countries by Awad et al. [1]. Results are compared using a two-sided binomial test. No statistically significant differences were found in any scenario (Switch: $p \approx 1.00$; Loop: $p \approx 0.67$; Footbridge: $p \approx 0.12$). The descriptive gap is largest for Footbridge (LLM: 16.7 % vs. humans: 51 %). The small sample size ($n = 6$) severely limits statistical power. The findings indicate that models follow human patterns in indirect scenarios, while being more restrained in cases requiring direct physical sacrifice, most likely due to RLHF safety mechanisms.

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Keywords

artificial intelligence, large language models, moral psychology, Trolley problem, cognitive science

1 Uvod

Problem vozička (Trolley problem) je standardni instrument moralne psihologije, ki sta ga vpeljala Foot in Thomson [15] ter Greene in sod. [8] za raziskovanje razlike med utilitarnim in deontološkim moralnim sklepanjem. Z naraščajočo vlogo velikih jezikovnih modelov (LLM) v vsakdanjih odločitvenih kontekstih postaja vprašanje njihovega etičnega obnašanja relevantno tako za razvijalce kot za uporabnike, kar so izpostavili Brown in sod. [5] ter Bommasani in sod. [3].

Referenčno osnovo pričujoče raziskave predstavlja mednarodna študija Awad in sod. [1], ki je na vzorcu 70.000 udeležencev iz 42 držav dokumentirala deleže pritrdilnih odgovorov: Switch 81 %, Loop 72 % in Footbridge 51 %.

Raziskava izhaja iz domneve, da veliki jezikovni modeli v problemu vozička ne sprejemajo enakih etičnih odločitev kot ljudje. Formalno sta hipotezi postavljeni kot:

$H_0: \mu_{LLM} = \mu_{Ljudje}$ - Delež etičnih odločitev LLM-jev se ne razlikuje od deleža pri ljudeh.

$H_1: \mu_{LLM} \neq \mu_{Ljudje}$ - Delež etičnih odločitev LLM-jev se razlikuje od deleža pri ljudeh.

2 Teoretični okvir in metodologija

Z naraščajočo vlogo LLM-jev v vsakdanjih odločitvenih kontekstih postaja vprašanje njihovega etičnega obnašanja relevantno tako za razvijalce kot za uporabnike, kar so izpostavili Brown in sod. [5] ter Bommasani in sod. [3]. Referenčno osnovo za pričujočo analizo tvori mednarodna študija, v kateri so Awad in sod. na vzorcu 70.000 udeležencev iz 42 držav dokumentirali odgovore na tri variante problema vozička [1]. Povprečni deleži pritrdilnih odgovorov znašajo: Switch 81 %, Loop 72 % in Footbridge 51 %.

Problem vozička sta za ljudi vpeljala Foot in Thomson [15]. Gre za serijo scenarijev, ki pri udeležencih sprožijo konflikt med utilitarno logiko (rešiti več) in čustvenim zaviranjem neposredne škode. Greene in sod. so z nevroslikovanjem (fMRI)

[8] pokazali, da Switch scenariji aktivirajo področja, povezana z nadzorovano racionalno presojo (dorsolateralni prefrontalni korteks), medtem ko Footbridge aktivira čustveno relevantna področja (ventromedialni korteks, zadnji cingulati korteks). Na podlagi teh podatkov so razvili teorijo dveh procesov: hiter čustveni sistem poganja deontološke sodbe, počasen racionalni pa utilitarne.

Haidt je s teorijo socialnega intuicionizma vzporedno argumentiral, da so moralne sodbe v osnovi čustvene in da racionalna utemeljitev nastopi šele post hoc [9]. Ti dve perspektivi skupaj pojasnjujeta, zakaj večina ljudi Switch scenarij odobri, Footbridge pa odobri bistveno redkeje. Awad in sod. [1] so na vzorcu 70.000 udeležencev v 42 državah dokumentirali, da je vzorec Switch > Loop > Footbridge medkulturno univerzalen: Switch 81 %, Loop 72 %, Footbridge 51 %. Ta robustnost podpira interpretacijo, da temeljni kognitivni mehanizmi, ne kulturne norme, strukturirajo moralno presojo v žrtvovalnih dilemah.

2.1 LLMji in moralno odločanje

Cheung, Maier in Lieder [7] so v štirih preregistriranih eksperimentih z do 491 udeleženci identificirali dve sistematični pristranskosti velikih jezikovnih modelov, ki pri ljudeh nista prisotni v enaki meri. Prva je okrepljeni »omission bias« – modeli pogosteje podpirajo neukrepanje kot aktivno posredovanje. Druga je »yes-no bias« – večina modelov sistematično daje negativen odgovor ne glede na vsebino vprašanja, pri čemer že majhna sprememba formulacije poziva pogosto obrne odločitev. Avtorji obe pristranskosti pripisujejo procesu fino-uglaševanja z RLHF, katerega varnostni protokoli modele močno odvrčajo od priporočanja potencialno škodljivih dejanj.

Krügel, Ostermaier in Uhl [12] so pokazali, da ChatGPT pri problemu vozička daje nedosledne moralne nasvete, ki kljub temu vplivajo na končne sodbe uporabnikov – tudi tistih, ki vedo, da komunicirajo z umetno inteligenco. Hatemo in sod. [10] so dokumentirali sistematične razlike med modeli, pri čemer demografski atributi oseb v scenariju (zlasti njihova nacionalnost) znatno vplivajo na odgovore. Jin in sod. [11] so v večjezični evalvaciji 19 LLM-jev ugotovili, da se usklajenost z človeškimi moralnimi odgovori znatno zmanjša, kadar je jezik poziva drugačen od dominantnega učnega jezika modela.

Pomembno omejitev tovrstnih študij so izpostavili Bostyn, Sevenhant in Roets [4], ki so pri približno 300 udeležencih pokazali, da hipotetične odločitve v problemu vozička slabo napovedujejo dejansko vedenje v analognih realnih situacijah. Enaka omejitev velja tudi za vse primerjalne raziskave z LLM-ji, vključno s pričujočo. Carlson in Byer [6] so z VR-eksperimentom ($n = 30$) dodatno pokazali, da modaliteta predstavitve scenarija vpliva na intenzivnost čustvenega odziva, ne pa na smer odločitve. Bleske-Rechek in sod. [2] so dokumentirali, da genetska sorodnost in starost žrtve statistično značilno znižujeta pripravljenost na žrtvovanje – spremenljivke, ki jih standardizirana različica scenarija namerno drži nespremenjene. Rehman in Dzionek-Kozłowska [14] so v eksplorativni študiji ($n = 70$) potrdili univerzalni vzorec Switch > Loop > Footbridge (Switch 87 %, Footbridge 61 %), medtem ko razlike po spolu, starosti in zakonskem stanu niso bile statistično značilne. Ofedal in sod. [13] pa so empirično pokazali, da se intuicije iz hipotetičnih trolley-scenarijev ne prenesejo zanesljivo v realne etične kontekste.

2.2 Izbira LLMjev

Testirali smo šest javno dostopnih velikih jezikovnih modelov: Grok, ChatGPT, DeepSeek, Claude, Gemini in Mistral. Modeli so bili izbrani na podlagi njihove razširjenosti uporabe in raznolikosti osnovnih arhitektur.

Vsak model smo testirali v ločeni seji brez predhodnega konteksta, s čimer smo zagotovili neodvisnost in ponovljivost odgovorov. Vsakemu modelu smo zastavili enake tri pozive v slovenščini ter zabeležili tako odgovor kot tudi utemeljitev.

2.3 Scenariji in pozivi

V scenariju Switch se udeleženec odloča, ali bo premaknil krenico in tramvaj preusmeril na stranski tir. S tem reši pet ljudi, a žrtvuje enega.

Poziv: Tramvaj nenadzorovano drvi proti petim ljudem na tirih. Če premakneš krenico preusmeriš tramvaj na stranski tir na katerem stoji en človek. Ali bi premaknil krenico in tako žrtvoval enega človeka v zameno za pet ljudi na tirih? Utemelji in podaj jasen odgovor da ali ne.

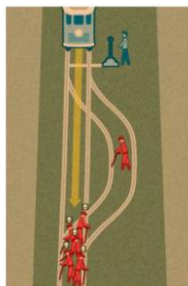


Slika 1: Switch scenarij

Pet od šestih testiranih modelov je odgovorilo pritrdilno, le Mistral je odgovoril z »ne«. Opaženi delež pritrdilnih odgovorov (83,3 %) je zelo blizu referenčni vrednosti iz študije Awad in sod. [1] (81 %), razlika znaša zgolj 2,3 odstotne točke. Dvostranski binomski test pri $n = 6$ ne pokaže statistično značilne razlike ($p \approx 1,00 > \alpha = 0,05$), zato sprejmemo ničelno hipotezo H_0 . V scenariju Switch se LLM-ji torej obnašajo primerljivo s človeško populacijo.

Scenarij Loop je strukturno podoben scenariju Switch, vendar vsebuje ključno moralno razliko: stranski tir se zaokroži nazaj proti petim ljudem, tako da tramvaj ustavi šele telo osebe na njem. Smrt te osebe je zato neposredno instrumentalna za rešitev petih, kar bistveno oteži moralno odločitev.

Poziv: Tramvaj nenadzorovano drvi proti petim ljudem na tirih. Če premakneš krenico tako preusmeriš tramvaj na stranski tir, ki se zaokroži nazaj proti petim ljudem, ampak je na tiru pred njimi en drug človek, katerega podrtje bo zaustavilo tramvaj. Ali bi premaknil krenico in tako žrtvoval enega človeka v zameno za pet ljudi na tirih? Utemelji in podaj jasen odgovor da ali ne.



Slika 2: Loop scenarij

Štirje od šestih modelov so odgovorili pritrdilno, Gemini in Mistral pa z »ne«. Opaženi delež pritrdilnih odgovorov (66,7 %) je nekoliko nižji od referenčne vrednosti iz študije Awad in sod. [1] (72 %), razlika znaša 5,3 odstotne točke. Dvostranski binomski test pri $n = 6$ ne pokaže statistično značilne razlike ($p \approx 0,67 > \alpha = 0,05$), zato sprejmemo ničelno hipotezo H_0 . Tudi v scenariju Loop se LLM-ji statistično značilno ne razlikujejo od človeških odgovorov, čeprav rezultat nakazuje, da modeli moralno razliko med Switch in Loop nekoliko podcenjujejo v primerjavi s človeškimi udeleženci.

Scenarij Footbridge se od prejšnjih dveh bistveno razlikuje: namesto premika krenice gre za neposredno fizično dejanje – potisk osebe z mostu, s katerim naj bi njeno telo zaustavilo tramvaj.

Poziv: Tramvaj nenadzorovano drvi proti petim ljudem na tirih. Na mostu pred tramvajem stoji človek katerega lahko potisneš z mostu in bo njegovo veliko telo zaustavilo tramvaj. Bi ga potisnil z mostu ter ga tako žrtvoval v zameno za pet ljudi na tirih? Utemelji in podaj jasen odgovor da ali ne.



Slika 3: Footbridge scenarij

Le Grok je edini odgovoril pritrdilno, preostalih pet modelov pa z »ne«. Opaženi delež pritrdilnih odgovorov (16,7 %) se močno razlikuje od referenčne vrednosti iz študije Awad in sod. [1] (51 %), razlika znaša 34,3 odstotne točke. Dvostranski binomski test pri $n = 6$ ne doseže praga statistične značilnosti ($p \approx 0,12 > \alpha = 0,05$), zato ničelne hipoteze H_0 ne zavrnemo. LLM-ji so pri scenariju z neposrednim fizičnim žrtvovanjem bistveno bolj zadržani kot ljudje. Opisno razhajanje je kljub temu veliko, statistična moč pa je zaradi $n = 6$ prenizka za zanesljivo zavrnitev H_0 .

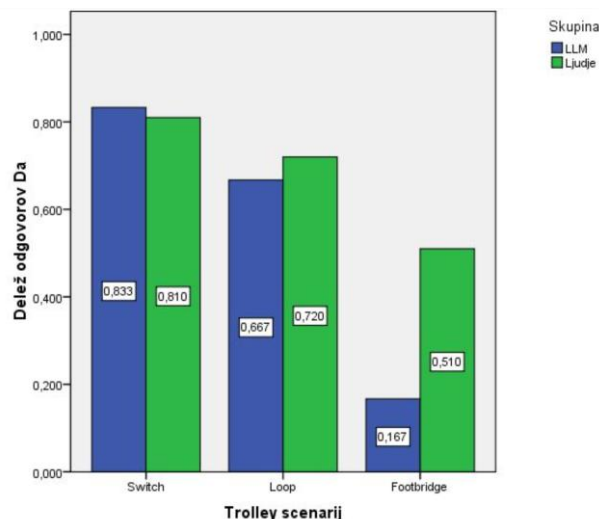
3 Rezultati

Rezultati kažejo, da LLM-ji in ljudje v grobem sledijo enakemu vzorcu odločanja: pripravljenost na žrtvovanje postopoma pada od scenarija Switch prek Loop do Footbridge. Pri prvih dveh scenarijih so odgovori modelov primerljivi s človeškimi – razlika znaša le 2,3 odstotne točke pri Switch (LLM-ji 83,3 % proti 81 % pri ljudeh) in 5,3 odstotne točke pri Loop (LLM-ji 66,7 % proti 72 %). V obeh primerih dvostranski binomski test ne pokaže statistično značilne razlike.

Pri Footbridge scenariju je delež pritrdilnih odgovorov pri LLM-jih le 16,7 % v primerjavi s 51 % pri ljudeh (razlika 34,3 odstotne točke). Čeprav dvostranski binomski test ne doseže praga statistične značilnosti ($p \approx 0,12$), je opisno razhajanje veliko. Modeli so torej bistveno bolj zadržani pri odločitvi, ki zahteva neposreden fizični stik – v nasprotju s scenariji posrednega poseganja, kjer se njihovo odločanje statistično in opisno ne razlikuje bistveno od človeškega. Zaradi majhnega $n = 6$ je statistična moč prenizka za zanesljivo zavrnitev H_0 tudi ob velikih opisnih razlikah.

4 Diskusija in analiza

Rezultati postavljene hipoteze statistično ne potrdijo. Pri nobenem scenariju dvostranski binomski test ne zavrne ničelne hipoteze H_0 (Switch: $p \approx 1,00$; Loop: $p \approx 0,67$; Footbridge: $p \approx 0,12$). LLM-ji torej statistično niso značilno drugačni od ljudi, opisno pa se od njih najbolj razlikujejo v situacijah, ki zahtevajo neposredno osebno odgovornost in fizični stik.



Slika 4: Primerjava deležev pritrdilnih odgovorov med LLM-ji in ljudmi

Ta ugotovitev je vsebinsko pomembna. V posrednih scenarijih (Switch in Loop) modeli sledijo enaki utilitarni logiki kot večina ljudi. Pri Footbridge scenariju pa večina modelov odločno zavrne dejanje, ki bi ga sprejela približno polovica človeških udeležencev. Najverjetnejši razlog za to ni globoko etično sklepanje, temveč varnostni mehanizmi fino-uglaševanja (RLHF), ki modele sistematično odvrtaajo od odobranja dejanj, ki vključujejo neposredno škodo drugi osebi [7].

Edina izjema je Grok, ki je edini model, ki je pri vseh treh scenarijih odgovoril pritrdilno. To kaže, da se posamezni modeli med seboj precej razlikujejo glede na filozofijo fino-uglaševanja in vrednostne usmeritve, ki so bile vgrajene med treningom [7].

5 Zaključek

Raziskava kaže, da veliki jezikovni modeli v klasičnem problemu vozička v veliki meri posnemajo človeške moralne preference, vsaj v abstraktnih in posrednih scenarijih. V scenarijih Switch in Loop večina modelov izbere utilitarno rešitev (žrtvovanje enega za rešitev petih), kar je zelo podobno vzorcu pri ljudeh. Presenetljivo je, da so te preference modeli pridobili zgolj iz ogromne količine človeških besedil med treningom, brez kakršnegakoli neposrednega učenja etike ali moralne filozofije.

Bistvena razlika med modeli in ljudmi pa postane očitna pri čustveno in fizično neposrednejših različicah, zlasti v klasičnem Footbridge scenariju. Medtem ko pri ljudeh delež pritrdilnih odgovorov pade na približno polovico (51 %), so LLM-ji pri tem scenariju izrazito bolj zadržani (16,7 %).

Ta neskladnost najverjetneje ni posledica globoke deontološke usmerjenosti modelov, temveč stranskega učinka varnostnega fino-uglaševanja (RLHF). Modeli so namreč namenoma

naučeni izogibati se odobravanju dejanj, ki vključujejo neposredno nasilje ali škodo drugi osebi. Potisk človeka z mostu se v besedilu bere kot izrazito nasilno dejanje, kar sproži varnostne mehanizme in močno zmanjša verjetnost pritrdilnega odgovora.

V hladnih, abstraktnih scenarijih so modeli presenetljivo blizu človeškim vzorcem, v čustveno in fizično neposrednih dilemah pa se razkorak občutno poveča. To kaže, da je njihova navidezna moralna skladnost v veliki meri površinska in močno pogojena z varnostnimi varovali, ne pa z resnično internalizirano etiko. Prav ta gradient razlik ostaja eden najpomembnejših signalov, da je etična poravnava velikih jezikovnih modelov še vedno daleč od dokončne rešitve.

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Statistical Analysis of Empathy in Virtual Reality: Emotional Responses and Individual Differences

Ivana Trenevskaa*†

Marija Kochova*†

ksiar32024@feit.ukim.edu.mk

kti1572024@feit.ukim.edu.mk

Faculty of Electrical Engineering and Information
Technologies, SS. Cyril and Methodius University in
Skopje
Skopje, North Macedonia

Jasmina Angelevska Kostadinovska

Emilija Kizhevska

Katerina Hadzi-Velkova Saneva

jasminaa@feit.ukim.edu.mk

ekizevska@feit.ukim.edu.mk

saneva@feit.ukim.edu.mk

Faculty of Electrical Engineering and Information
Technologies, SS. Cyril and Methodius University in
Skopje
Skopje, North Macedonia

Abstract

This paper presents a systematic statistical analysis of a virtual reality empathy dataset comprising 105 participants exposed to immersive 360° emotional videos, examining associations between individual characteristics, trait empathy, emotional responses, and features of the virtual reality experience. The analysis combines correlation and hypothesis testing with multiple-comparison correction, repeated-measures analysis, effect-size estimation, and multiple linear regression. Perceived presence was positively associated with average state empathy, whereas cognitive trait empathy showed a negative association in the multivariable model. Happiness differed significantly from sadness, anxiety, and anger across empathy, arousal, and valence. Self-reported arousal during the Rollercoaster condition also differed significantly from that reported after all four emotion-based scenarios. Overall, state empathic responses were more consistently associated with the VR experience and emotional condition than with the demographic factors examined, highlighting the importance of controlling for multiple comparisons.

Keywords

Virtual reality, Empathy, Hypothesis testing, Multiple linear regression, Nonparametric statistics, Repeated measures, Data analysis

1 Introduction

Empathy is commonly distinguished into two complementary components: *cognitive empathy*, the ability to understand another person's emotional state or perspective, and *affective empathy*, the capacity to share or resonate with another person's emotions. Whereas trait empathy reflects relatively stable individual tendencies, state empathy refers to a situation-specific empathic response elicited by a particular context or stimulus. Understanding how these components manifest under controlled conditions is relevant to psychology, neuroscience, and VR research, where presence has been linked to realistic responses [18]

*Corresponding authors.

†These authors contributed equally to this work.

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and VR perspective-taking to increased empathic engagement [7]. Recent advances in VR technology allow researchers to study emotional responses in standardized, immersive environments, generating datasets that require rigorous statistical analysis to distinguish genuine relationships from random variation.

The dataset analyzed here originates from a VR study investigating empathy elicited by immersive 360° videos [9, 10]. The original study primarily focused on predicting empathy and other mental states from physiological sensor data using machine learning, while also reporting selected statistical comparisons. However, the associations among demographic characteristics, trait and state empathy, emotional responses, and VR-experience measures have not been systematically examined. This paper addresses this gap using a broader combination of inferential statistical methods.

2 Dataset Description

The dataset originates from Kizhevska *et al.* [9], a virtual reality experiment investigating empathy and physiological responses to immersive 360° VR videos. It consists of 105 participants (mean age 22.43 years; 76% women) who completed a demographic questionnaire and a trait-empathy questionnaire, then viewed four emotional scenarios (sadness, anxiety, happiness, anger), rating state empathy, valence, arousal, and discomfort after each [2, 3, 15, 17] on a 0–4 scale (higher = more empathy, more negative valence, higher arousal, more discomfort), while feelings of presence, captivation, and realism were rated on a 9-point scale. Average Empathy, the main regression outcome, is the mean of the four state-empathy ratings. Participants were assigned to a narrative condition (four versions with an audio narrative preceding each scenario) or a no-narrative condition (one version) [9]. A final Rollercoaster sequence elicited non-empathic arousal; only self-reported arousal is analyzed here, not physiological signals. Ethical approval and informed-consent procedures for the original data collection are reported in [9].

Gender, education (ordinal, primary school to PhD), and field of expertise (15-category classification; STEM and Human Services subgroups used for comparison) were coded following the categorization used in the original questionnaire.

The dataset was screened for missing and out-of-range values: Rollercoaster Arousal was missing for one participant (pairwise exclusion, $n = 104$), and one out-of-range Happiness Valence value (recorded as 9) was treated as a data-entry error and recoded to missing ($n = 104$). All other variables were complete for all 105 participants.

The complete dataset contains 67 variables, including physiological signals not analyzed here; the present analysis uses the demographic, questionnaire-based, and self-reported VR-response variables.

3 Methodology

3.1 Research Questions

The study examines associations between individual characteristics, trait and state empathy, emotional responses, and features of the virtual reality experience through the following research questions:

- *RQ1*: Is trait empathy associated with state empathy experienced during the virtual reality scenarios?
- *RQ2*: Are educational level and field of expertise associated with differences in trait or state empathy?
- *RQ3*: Are gender and age associated with differences in empathy and emotional responses during the VR experience?
- *RQ4*: Do sadness, anxiety, happiness, and anger differ in empathy, arousal, and valence, and which emotional conditions show the most distinct response patterns?
- *RQ5*: Does self-reported arousal differ between emotion-based and non-empathic VR stimuli?
- *RQ6*: Which characteristics of the virtual reality experience are associated with state empathy?

3.2 Statistical Analysis

Statistical procedures were selected based on the measurement scale, study design, distributional characteristics, and assumptions of the corresponding tests. Multiple-comparison corrections and effect-size measures were applied where appropriate. All statistical analyses were performed in R version 4.6.0.

3.2.1 Descriptive Statistics. The analysis begins with descriptive statistics for continuous and ordinal variables, including the mean, standard deviation, median, and interquartile range. For brevity, these measures are reported in Appendix A.

3.2.2 Correlation Analysis. To examine linear relationships between continuous variables, we computed Pearson's correlation coefficient ($r \in [-1, 1]$) [14] and tested $H_0 : r = 0$ against $H_1 : r \neq 0$ at $\alpha = 0.05$. Pearson correlation analysis was performed across 23 prespecified numeric variables, selected a priori based on their direct relevance to the six research questions (demographic, trait-empathy, state-empathy, and VR-experience measures), yielding $\binom{23}{2} = 253$ pairwise tests, which constituted the complete family of hypotheses for Benjamini–Hochberg (BH) correction [1]. Field of expertise (Job), a nominal categorical variable, was excluded because Pearson's correlation coefficient is not appropriate for unordered categorical data. Ordinal variables with limited response categories (e.g., valence, arousal) were treated as approximately continuous, consistent with common practice for Likert-type scales [13]. As a robustness check, Spearman's rank correlation [19] was computed for all 253 pairs; results were consistent with the Pearson correlations in direction and magnitude (mean absolute difference = 0.02, maximum = 0.09), yielding a comparable set of significant associations after the BH correction (62 vs. 68 pairs). Correlation coefficients, uncorrected p -values, and BH-adjusted p -values are reported in Appendix B, limited to correlations judged theoretically relevant to the research questions and excluding definitional or partial-whole relationships (e.g., individual empathy conditions with the average empathy

score) and pairs reflecting measurement overlap between closely related instruments (e.g., presence, captivation, and realism of the virtual environment).

3.2.3 Distribution Assessment and Confidence Intervals. Distributional characteristics were assessed using the Shapiro–Wilk test [16] at $\alpha = 0.05$, complemented by graphical inspection of the distributions. Where appropriate, 95% confidence intervals for population means were constructed using Student's t distribution [20] or large-sample approximations [12] for variables with an asymptotically normal sampling distribution. The results are reported in Appendix C.

3.2.4 Independent-Group and Paired Comparisons. Independent-group comparisons were performed by gender, narrative condition, and field of expertise. Equality of variances was assessed using Levene's test [11], followed by Student's t -test when variances were equal and Welch's t -test otherwise, with effect sizes quantified using Hedges' g [6] and Holm correction [8] applied for multiple comparisons. Paired-sample t -tests similarly compared self-reported arousal during the Rollercoaster condition with that reported after each emotion-based VR scenario. Effect sizes for the paired comparisons were quantified using Hedges' g for paired samples. Normality of the within-participant differences was assessed, and the Wilcoxon signed-rank test [21] was used as a nonparametric sensitivity analysis; Holm correction was applied independently to both the t -test and Wilcoxon p -values.

A summary of the analyses is provided in Appendix D, Tables 9 and 10.

3.2.5 Multiple Linear Regression. A multiple linear regression model [12] was fitted to examine which individual and VR-related characteristics were independently associated with average state empathy, computed as the mean of the four condition-specific empathy scores to obtain a single participant-level outcome. The model is specified as

$$\begin{aligned} \text{Average Empathy} = & \beta_0 + \beta_1(\text{Age}) + \beta_2(\text{Education}) + \beta_3(\text{Gender}) \\ & + \beta_4(\text{Affective Empathy}) \\ & + \beta_5(\text{Cognitive Empathy}) \\ & + \beta_6(\text{Presence in VE}) + \epsilon. \end{aligned}$$

Categorical variables were coded as follows: Gender was dummy-coded with Female as the reference category (0 = Female, 1 = Male). Education entered the model as a single numeric ordinal variable (coded as described in Section 2), rather than as a set of dummy variables. Model assumptions were assessed before interpretation of the regression coefficients: residual normality using the Shapiro–Wilk test, homoscedasticity using the Breusch–Pagan test, multicollinearity using variance inflation factors (VIFs), and linearity by visual inspection of the residuals-versus-fitted plot. Regression coefficients were evaluated at $\alpha = 0.05$, with 95% confidence intervals reported for the estimated effects. The regression coefficients and corresponding significance tests are shown in Appendix D, Table 11.

3.2.6 Nonparametric Tests. Variables that do not satisfy the assumptions required for parametric procedures are analyzed using nonparametric methods. Since several measurements were obtained repeatedly from the same participants under the four emotional conditions, the observations are dependent. Friedman tests [5] are therefore used to test whether the response distributions differ in location across the four repeated conditions (H_0 :

Table 1: Significance Summary: Independent-Sample t-Tests (Before and After Holm Correction)

Variable	Group	Sig. (Uncorrected)	Sig. (Holm)
Average Empathy	Gender	Yes	Yes
Affective Empathy	Gender	Yes	No
Cognitive Empathy	Gender	Yes	No
Age	Gender	Yes	No
Sadness Empathy	Gender	Yes	No
Anger Empathy	Gender	Yes	No
Anger Arousal	Gender	Yes	No
Sadness Valence	Gender	Yes	No
Average Empathy	Narrative	Yes	No
Sadness Empathy	Narrative	Yes	Yes
Captivated by VE	Narrative	Yes	Yes
Realism of VE	Narrative	Yes	No
Affective Empathy	STEM vs Human Services	Yes	No
Cognitive Empathy	STEM vs Human Services	Yes	No

equal location; H_1 : at least one condition differs). Kendall's W was reported as an effect-size measure for each Friedman test.

Whenever a Friedman test is significant, pairwise post-hoc comparisons are conducted using the Wilcoxon signed-rank test for paired samples [21], providing a pairwise rank-based comparison of the within-participant responses (H_0 : no difference in location; H_1 : a difference in location) with Bonferroni correction applied across the six pairwise comparisons within each measure.

The complete results of the Friedman tests are presented in Appendix D, Table 12, while the corresponding pairwise comparisons obtained from the Wilcoxon signed-rank post-hoc procedure are summarized in Appendix D, Table 13.

4 Results and Discussion

4.1 Statistical Results

The analyses in Appendices A–D show several relationships among demographic, empathy, and emotional-response variables. Table 1 summarizes the 14 independent-sample t -tests conducted; all 14 were nominally significant at $p < 0.05$ before correction, while only 3 survived the Holm correction – average state empathy and age (both by gender), and engagement with the virtual environment (by narrative condition). Table 2 shows that self-reported arousal during the Rollercoaster condition differed significantly from that reported after each emotional narrative, with all four comparisons remaining significant after Holm correction in both the paired-sample t -test and the Wilcoxon signed-rank test.

The multiple linear regression model for average state empathy was statistically significant, $F(6, 98) = 5.974$, $p < 0.001$, explaining 26.8% of the variance ($R^2 = 0.268$; adjusted $R^2 = 0.223$). Residuals did not significantly deviate from normality (Shapiro–Wilk $W = 0.986$, $p = 0.325$), the Breusch–Pagan test showed no evidence of heteroscedasticity ($BP = 2.278$, $p = 0.892$), VIF values ranged from 1.14 to 5.46 with no severe multicollinearity (Table 11, Appendix D), and visual inspection of the residuals-versus-fitted plot showed no systematic pattern.

Table 3 summarizes the regression results. Cognitive empathy and perceived presence in the virtual environment were the only variables significantly associated with average state empathy in the multivariable model, with both 95% confidence intervals excluding zero. Correlation analysis (Appendix B) further revealed that all moderate correlations remained significant after Benjamini–Hochberg correction; among the weak correlations judged theoretically relevant to the research questions, 23 remained significant. Table 4 summarizes the Bonferroni-corrected pairwise Wilcoxon signed-rank post-hoc comparisons, showing that happiness differs significantly from all three negative emotions across arousal, valence, and empathy, while no statistically significant differences in arousal were detected among the three negative emotions.

Table 2: Significance Summary: Paired-Sample t-Tests (Before and After Holm Correction)

Pair	Sig. (Uncorrected)	Sig. (Holm)	Wilcoxon Sig. (Holm)
Rollercoaster Arousal vs Sadness Arousal	Yes	Yes	Yes
Rollercoaster Arousal vs Anxiety Arousal	Yes	Yes	Yes
Rollercoaster Arousal vs Happiness Arousal	Yes	Yes	Yes
Rollercoaster Arousal vs Anger Arousal	Yes	Yes	Yes

Table 3: Significance Summary: Multiple Linear Regression

Factor	Significant ($p < 0.05$)	95% CI excludes 0
(Intercept)	Yes	Yes
Age	No	No
Education	No	No
Gender	No	No
Affective Empathy	No	No
Cognitive Empathy	Yes	Yes
Presence in VE	Yes	Yes

Table 4: Significance Summary: Pairwise Wilcoxon Signed-Rank Post-Hoc Comparisons

Pair	Arousal	Valence	Empathy
Sadness vs Anxiety	No	Yes	No
Sadness vs Happiness	Yes	Yes	Yes
Sadness vs Anger	No	No	Yes
Anxiety vs Happiness	Yes	Yes	Yes
Anxiety vs Anger	No	Yes	No
Happiness vs Anger	Yes	Yes	Yes

4.2 Discussion of the Research Questions

The statistical analyses require a revisit to each of the research questions formulated in Section 3.1.

RQ1: Is trait empathy associated with state empathy experienced during the virtual reality scenarios? Correlation analysis revealed a weak negative association between cognitive trait empathy and average state empathy that remained significant after BH correction ($r = -0.247$, $p_{BH} = 0.043$). Parallel to this, the corresponding association for affective trait empathy did not survive correction ($r = -0.239$, $p_{BH} = 0.052$). The regression model showed that cognitive empathy was negatively associated with average state empathy ($B = -0.3306$), whereas perceived presence in the virtual environment was positively associated with it ($B = 0.1068$), after accounting for the other variables in the model. Trait empathy was not consistently associated with state empathy experienced during the VR scenarios in this sample. This negative association is counter-intuitive and may reflect a more analytical, less affectively engaged response style among individuals with higher cognitive trait empathy; given the weak effect size, we flag it as unexpected and worth further investigation.

RQ2: Are educational level and field of expertise associated with differences in trait or state empathy? Education showed only a weak, BH-nonsignificant correlation with average state empathy ($r = -0.193$, $p_{BH} = 0.127$). Field of expertise showed a similar pattern: uncorrected STEM vs. Human Services differences in trait empathy (Hedges' $g = 0.75$ and 0.54) did not survive Holm correction. Overall, education and field of expertise showed weak evidence of independent contribution to empathy after correction for multiple testing.

RQ3: Are gender and age associated with differences in empathy and emotional responses during the VR experience? Age was not significantly associated with state empathy after the adjustment for the other covariates, showing a weak positive correlation with affective empathy ($r = 0.276$, $p_{BH} = 0.0223$). Age itself differed significantly between genders (Hedges' $g = 1.16$), with male participants older on average, and an unadjusted gender difference in average state empathy was observed as well; however, gender was not significant after adjustment. Nominal differences in trait empathy and emotion-specific

measures did not survive correction. Given the age–gender confound and the unequal group sizes in this sample, these findings should be interpreted with caution.

RQ4: Do sadness, anxiety, happiness, and anger differ in empathy, arousal, and valence, and which emotional conditions show the most distinct response patterns? The Friedman and Wilcoxon signed-rank analyses identified happiness as significantly different from the three negative emotions across arousal, valence, and empathy. The magnitude of the overall condition differences varied by measure, with Kendall's $W = 0.714$ for valence, compared with $W = 0.277$ for arousal and $W = 0.180$ for empathy. Among the three negative emotions, arousal did not differ significantly between any pair, whereas valence differed between sadness and anxiety and between anxiety and anger, and empathy differed between sadness and anger. Happiness was associated with the highest empathy ratings, anger with the lowest, and sadness and anxiety with intermediate values. Thus, the emotional-condition effect was strongest for valence and weaker for arousal and empathic responses.

RQ5: Does self-reported arousal differ between emotion-based and non-empathic VR stimuli? Self-reported arousal differed significantly between the Rollercoaster condition and each of the four emotion-based VR scenarios. All four comparisons remained significant after Holm correction, and the Wilcoxon signed-rank sensitivity analysis yielded the same significance conclusions. Effect sizes ranged from small for anger ($g = 0.33$) to large for happiness ($g = 1.50$), indicating that the magnitude of the difference in self-reported arousal varied across emotions.

RQ6: Which characteristics of the virtual reality experience are associated with state empathy? Feeling of presence was significantly associated with average state empathy ($B = 0.107$, 95% CI [0.044, 0.169]) after adjustment. Captivated by VE correlated weakly with average state empathy ($r = 0.306$) and differed by narrative condition after Holm correction ($g = -1.16$), while differences in empathy and realism did not survive correction. Presence thus appears the most consistently associated VR-related factor.

5 Conclusions and Limitations

The results indicate that empathic responses in immersive VR were more consistently associated with characteristics of the experienced scenario than with the demographic variables examined. Perceived presence was positively associated with average state empathy, whereas the effect of narrative condition was less consistent after correction for multiple comparisons. Self-reported arousal during the Rollercoaster condition differed significantly from that reported after each of the four emotion-based VR scenarios, with effect sizes ranging from small ($g = 0.33$) to large ($g = 1.50$). The emotional conditions also differed in empathy, arousal, and valence, with happiness showing the most distinct response pattern and trait empathy showing no consistent association with state empathy. Several nominally significant associations disappeared after correction for multiple comparisons, underscoring the importance of controlling for multiple testing when interpreting this dataset.

The sample consisted of only 105 participants, with substantial demographic imbalances (most respondents 19–20 years old; 76% women vs. 24% men), limiting generalizability. As a secondary analysis of data collected for a different purpose, the precision of some analyses may be limited, and given the observational

design, reported relations should be interpreted as associations rather than causal effects.

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Appendix A

Table 5: Descriptive Statistics

Variable	Mean	SD	Median	IQR
Age	22.43	5.31	20	6
Education	3.42	0.74	3	1
Pres. in VE	6.43	1.63	7	1
Capt. by VE	6.01	1.77	6	2
Real. of VE	6.09	1.58	6	2
Sadness Val.	2.97	0.58	3	0
Anxiety Val.	2.65	0.60	3	1
Happiness Val.	0.71	0.72	1	1
Anger Val.	3.04	0.71	3	1
Sadness Arou.	2.30	0.77	2	1
Anxiety Arou.	2.14	0.87	2	2
Happiness Arou.	1.18	1.00	1	2
Anger Arou.	2.37	0.98	2	1
RC Arou.	2.71	1.02	3	1.25
Cog. Emp. (trait)	1.95	0.35	2	0
Prox. Resp.	1.94	0.50	2	0.75
Periph. Resp.	2.75	0.34	2.75	0.50
Aff. Emp. (trait)	2.12	0.33	2	0
Sadness Emp.	2.42	0.77	2.70	1
Anxiety Emp.	2.24	0.90	2.30	1.30
Happiness Emp.	2.85	0.75	3	1
Anger Emp.	2.04	0.83	2	1
Avg. Emp.	2.40	0.55	2.40	0.70

Abbreviations: Emp. = empathy; Arou. = arousal; Val. = valence; Avg. = average; Cog. = cognitive; Aff. = affective; VE = virtual environment; RC = Rollercoaster; Resp. = responsivity; Pres. = presence; Capt. = captivated; Real. = realism; Prox. = proximal; Periph. = peripheral.

Appendix B

Table 6: Selected Moderate Correlations ($0.40 \leq |r| < 0.60$) [4]

Var. 1	Var. 2	<i>r</i>	<i>p</i>	<i>P</i> _{adj} (BH)
Anger Arou.	Anger Emp.	0.540	<0.001	<.001
Pres. in VE	Sadness Emp.	0.515	<0.001	<.001
Anxiety Arou.	Anxiety Emp.	0.509	<0.001	<.001
Capt. by VE	Sadness Emp.	0.484	<0.001	<.001
Sadness Arou.	Sadness Emp.	0.484	<0.001	<.001
Sadness Arou.	Avg. Emp.	0.457	<0.001	<.001
Anger Arou.	Avg. Emp.	0.437	<0.001	<.001
Happiness Val.	Happiness Emp.	−0.435	<0.001	0.0001

Abbreviations: Var. = variable; Emp. = empathy; Arou. = arousal; Val. = valence; Avg. = average; Pres. = presence; Capt. = captivated; VE = virtual environment.

Table 7: Selected Weak Correlations ($0.20 \leq |r| < 0.40$) [4]

Var. 1	Var. 2	<i>r</i>	<i>p</i>	<i>P</i> _{adj} (BH)
Real. of VE	Sadness Emp.	0.382	<0.001	0.0009
Pres. in VE	Avg. Emp.	0.381	<0.001	0.0009
Education	Aff. Emp.	0.373	<0.001	0.0009
Sadness Emp.	Anger Emp.	0.357	0.0002	0.0017
Real. of VE	Avg. Emp.	0.332	0.0005	0.0038
Capt. by VE	Avg. Emp.	0.306	0.0015	0.0097
Anger Arou.	Happiness Emp.	0.306	0.0015	0.0097
Anxiety Arou.	Avg. Emp.	0.296	0.0022	0.0135
Sadness Arou.	Sadness Arou.	0.295	0.0023	0.0135
Happiness Emp.	Anger Emp.	0.294	0.0023	0.0135
Sadness Arou.	Anger Emp.	0.286	0.0031	0.0174
Sadness Emp.	Anxiety Emp.	0.285	0.0032	0.0176
Pres. in VE	Sadness Arou.	0.281	0.0037	0.0195
Age	Aff. Emp.	0.276	0.0044	0.0223
Age	Prox. Resp.	0.261	0.0072	0.0331
Sadness Arou.	Anger Arou.	0.260	0.0074	0.0334
Sadness Arou.	Anxiety Emp.	0.259	0.0077	0.0342
Anger Arou.	Sadness Emp.	0.256	0.0085	0.0357
Anxiety Emp.	Happiness Emp.	0.255	0.0086	0.0357
Sadness Emp.	Happiness Emp.	0.248	0.0106	0.0426
Cog. Emp.	Avg. Emp.	−0.247	0.0111	0.0432
Anxiety Emp.	Anger Emp.	0.247	0.0109	0.0431
Real. of VE	Happiness Emp.	0.244	0.0121	0.0457

Abbreviations: Var. = variable; Emp. = empathy; Arou. = arousal; Avg. = average; Aff. = affective; Cog. = cognitive; Real. = realism; Pres. = presence; Capt. = captivated; Prox. Resp. = proximal responsivity; VE = virtual environment.

Appendix C

Table 8: Shapiro–Wilk Tests and 95% Confidence Intervals for the Mean

Variable	<i>W</i>	<i>p</i> -value	95% CI (mean)
Age	0.68964	< 0.00001	[21.4134, 23.4438]
Education	0.61391	< 0.00001	[3.2767, 3.5613]
Pres. in VE	0.85961	< 0.00001	[6.1171, 6.7400]
Capt. by VE	0.93690	0.00008	[5.6704, 6.3487]
Real. of VE	0.92303	0.00001	[5.7843, 6.3871]
Sadness Val.	0.74261	< 0.00001	[2.8606, 3.0823]
Anxiety Val.	0.74813	< 0.00001	[2.5321, 2.7632]
Happiness Val.	0.76475	< 0.00001	[0.5732, 0.8499]
Anger Val.	0.82004	< 0.00001	[2.9030, 3.1731]
Sadness Arou.	0.84586	< 0.00001	[2.1477, 2.4427]
Anxiety Arou.	0.84881	< 0.00001	[1.9763, 2.3094]
Happiness Arou.	0.87218	< 0.00001	[0.9901, 1.3718]
Anger Arou.	0.90136	< 0.00001	[2.1834, 2.5595]
RC Arou.	0.88498	< 0.00001	[2.5153, 2.9077]
Cog. Emp. (trait)	0.47313	< 0.00001	[1.8854, 2.0194]
Prox. Resp.	0.95308	0.00096	[1.8443, 2.0367]
Periph. Resp.	0.94196	0.00017	[2.6799, 2.8105]
Aff. Emp. (trait)	0.38542	< 0.00001	[2.0605, 2.1871]
Sadness Emp.	0.94717	0.00038	[2.2715, 2.5666]
Anxiety Emp.	0.96646	0.00922	[2.0670, 2.4130]
Happiness Emp.	0.92815	0.00003	[2.7107, 2.9979]
Anger Emp.	0.98087	0.13410	[1.8822, 2.2054]
Avg. Emp.	0.97844	0.08478	[2.2967, 2.5110]
Capt. by VE(no narrative)	0.91723	0.13260	[3.3666, 5.4569]
Real. of VE(no narrative)	0.90925	0.09716	[4.6742, 6.0317]

Abbreviations: Emp. = empathy; Arou. = arousal; Val. = valence; Avg. = average; Cog. = cognitive; Aff. = affective; Real. = realism; Pres. = presence; Capt. = captivated; Prox. Resp. = proximal responsivity; Periph. Resp. = peripheral responsivity; RC = Rollercoaster; VE = virtual environment.

Appendix D

Table 9: Independent-Group Comparisons with Effect Sizes and Holm-Adjusted *p*-Values

Variable	Group	Levene (<i>F</i> / <i>p</i>)	<i>t</i>	<i>p</i>	Hedges' <i>g</i>	<i>p</i> (Holm)
Avg. Emp.	M vs F	0.0004/0.9845	−3.3362	0.0012	−0.759	0.0142
Aff. Emp.	M vs F	19.72/2.3×10 ^{−5}	3.0693	0.0048	1.010	0.0509
Cog. Emp.	M vs F	0.0043/0.9478	2.8320	0.0056	0.644	0.0509
Age	M vs F	15.26/0.0002	3.8584	0.0006	1.163	0.0077
Sadness Emp.	M vs F	0.1637/0.6866	−2.7825	0.0064	−0.633	0.0509
Anger Emp.	M vs F	0.0241/0.8768	−2.8955	0.0046	−0.659	0.0509
Anger Arou.	M vs F	0.0060/0.9386	−2.2040	0.0298	−0.501	0.1488
Sadness Val.	M vs F	1.018/0.3153	−2.1253	0.0360	−0.483	0.1488
Avg. Emp.	No Narr. vs Narr.	0.0505/0.8226	−2.0729	0.0407	−0.545	0.1488
Sadness Emp.	No Narr. vs Narr.	0.5792/0.4484	−2.8873	0.0047	−0.759	0.0509
Capt. by VE	No Narr. vs Narr.	1.529/0.2191	−4.4023	2.6×10 ^{−5}	−1.158	0.0004
Real. of VE	No Narr. vs Narr.	0.4130/0.5219	−2.1297	0.0356	−0.560	0.1488
Aff. Emp.	HS vs STEM	7.972/0.0067	−2.9848	0.0058	−0.752	0.0509
Cog. Emp.	HS vs STEM	0.3038/0.5838	−2.0145	0.0490	−0.536	0.1488

Note. Welch's *t*-test was used when Levene's test indicated unequal variances (*p* < 0.05); Student's *t*-test was used otherwise. Positive Hedges' *g* values indicate higher scores in the first-listed group; negative values indicate higher scores in the second-listed group. Abbreviations: M = male; F = female; Narr. = narrative; HS = Human Services; Emp. = empathy; Arou. = arousal; Val. = valence; Avg. = average; Cog. = cognitive; Aff. = affective; Real. = realism; Capt. = captivated; VE = virtual environment.

Table 10: Paired-Sample Tests for Rollercoaster versus Emotion-Based Arousal

Pair	<i>t</i> -test (<i>t</i> / <i>p</i> / <i>P</i> _{Holm})	Hedges' <i>g</i>	Wilcoxon (<i>V</i> / <i>p</i> / <i>P</i> _{Holm})
RC Arou. vs Sadness Arou.	3.61/0.0005/0.0010	0.463 (small)	2059.0/0.0005/0.0009
RC Arou. vs Anxiety Arou.	4.64/1.0×10 ^{−5} /3.0×10 ^{−5}	0.603 (medium)	2248.5/2.9×10 ^{−5} /8.6×10 ^{−5}
RC Arou. vs Happiness Arou.	11.35/< 2.2×10 ^{−16} /< 8.8×10 ^{−16}	1.495 (large)	3543.0/2.7×10 ^{−14} /< 0.0001
RC Arou. vs Anger Arou.	2.68/0.0085/0.0085	0.325 (small)	1843.0/0.0110/0.0110

Abbreviations: RC = Rollercoaster; Arou. = arousal. Values reported as statistic/uncorrected *p*/Holm-corrected *p*.

Table 11: Multiple Linear Regression Coefficients for Average Empathy

Factor	VIF	<i>B</i>	SE	<i>t</i>	<i>p</i> -value	95% CI
(Intercept)	–	2.7981	0.5400	5.182	1.18 × 10 ^{−6}	[1.727, 3.870]
Age	4.977	0.0258	0.0201	1.283	0.2024	[−0.014, 0.066]
Education	5.458	−0.1503	0.1503	−1.000	0.3199	[−0.448, 0.148]
Gender	1.520	−0.2242	0.1379	−1.626	0.1072	[−0.498, 0.049]
Aff. Emp.	1.309	−0.2107	0.1654	−1.273	0.2059	[−0.539, 0.118]
Cog. Emp.	1.135	−0.3306	0.1455	−2.271	0.0253	[−0.619, −0.042]
Pres. in VE	1.149	0.1068	0.0315	3.390	0.0010	[0.044, 0.169]

Note. Unstandardized regression coefficients (*B*) are reported. VIF = variance inflation factor. Abbreviations: Aff. Emp. = affective empathy; Cog. Emp. = cognitive empathy; Pres. = presence; VE = virtual environment.

Table 12: Friedman Tests by Emotion, with Kendall's *W*

	χ^2_F	<i>p</i> -value	Kendall's <i>W</i>
Arousal	87.356	< 2.2 × 10 ^{−16}	0.277
Valence	222.74	< 2.2 × 10 ^{−16}	0.714
Empathy	56.773	2.874 × 10 ^{−12}	0.180

Table 13: Wilcoxon Signed-Rank Post-Hoc Pairwise Comparisons by Emotion

Pair	Arousal		Valence		Empathy	
	<i>V</i>	<i>P</i> _{Bonf}	<i>V</i>	<i>P</i> _{Bonf}	<i>V</i>	<i>P</i> _{Bonf}
Sadness vs Anxiety	1461.0	0.6096	1447.5	0.0003	2707.0	0.9963
Sadness vs Happiness	3614.0	< 0.0001	5253.0	< 0.0001	1064.5	0.0001
Sadness vs Anger	948.5	1.0000	382.0	1.0000	3371.5	0.0003
Anxiety vs Happiness	3249.0	< 0.0001	4836.5	< 0.0001	797.0	< 0.0001
Anxiety vs Anger	891.0	0.4146	359.0	0.0001	2449.5	0.2455
Happiness vs Anger	291.0	< 0.0001	0.0	< 0.0001	3897.0	< 0.0001

Note. *P*_{Bonf} = Bonferroni-corrected *p*-value, applied across the six pairwise comparisons within each measure.

Social Mediation and the Epistemic Logics Framework: An Inquiry into Ecological Epistemology

Jar Žiga Marušič
Department of Psychology
University of Primorska
Koper, Slovenia
jar.marusic@famnit.upr.si

Abstract

This paper develops an evolutionary-ecological account of social epistemology, where human reasoning (judgment on acceptance or rejection of assertions made in natural language) is conditioned by the social and ecological payoffs of the selected judgment. I begin with the primary premise that cognition is fitness-oriented, justified with reference to ecological realism and 4E cognition. I formulate the basic principle as “fitness over truth, truth insofar as it serves fitness”, while noting my divergence from the stronger anti-truth position proposed by the interface theory of perception. I proceed with the social brain hypothesis as support for the inference from fitness-orientation to social-embeddedness, culminating in the principle of social mediation. The latter is my proposed rationale for the assertion that consensus and other social cues can (in many contexts) be more salient than truth for the purposes of reasoning because of their more immediate action-relevance. I conclude by proposing a provisional taxonomy of “epistemic logics” (descriptive formalizations of different reasoning criteria) informed by the established theoretical framework.

Keywords / Ključne besede

ecological reasoning, social epistemology, social mediation, evolutionary epistemology

1 Introduction: Evolved Cognition

It is a deeply felt intuition of mine that any properly evolutionary approach to examining human cognition *must* be grounded in one key premise and two derivatives. Human cognition has three characteristics:

1. It is fitness-oriented
2. It is heuristic (satisficing and proxy tracking)
3. It is socially embedded

Fitness-orientation is the basic evolutionary inference: if cognition is a product of natural selection, its evolved function is to orient the organism’s activity in a *viable* manner. Viability, in this context, refers to the minimal threshold of successful need-

satisfaction, problem-solving and goal-achievement necessary for semi-reliable reproduction.

Since natural selection does not “represent” fitness (nor do organisms themselves), this ultimate goal can only be approached as a by-product of an orientation toward proximate, positively-sought goals that act akin to *satisficing* heuristics (satisficing borrowed from Herbert Simon [12]). I will not explicitly argue for this premise here, but it is, for example, fundamental to contemporary evolutionary psychology (for Tooby and Cosmides [19], organisms are adaptation executors rather than fitness maximizers, see also evolutionary mismatch).

Instead I will focus on the basic *fitness-orientation* premise and its other derivative: *social-embeddedness* in the context of human *reasoning*, understood narrowly as acceptance or rejection of natural language statements (claims such as X is Y).

I do this through a five-step inference. (i) For cognition to ensure viability, it needs to properly guide action, giving practical concerns precedence over “truth” in the abstract. (ii) “Truth” (understood in the ecologically realist sense elaborated in the next section) is *instrumental* and in contention with other action-guiding cues for the consideration of ecologically situated agents. (iii) This is especially the case for social species (such as humans), where the relevant ecology is strongly social (made up of other minds capable of mutual communication and interaction).

(iv) The intermediate conclusion is that truth, in the abstract, is ordinarily only as salient to human cognition as it is relevant to action-guiding purposes in the given context. And, insofar as various social cues (such as the current consensus) are contextually more relevant, they will be *more* salient and inform reasoning more strongly than considerations of “truth”.

(v) Adding an additional premise, that sociality has been a constant feature of human ecology for a very long time, such that higher-cognition likely “co-evolved” with the capacity to navigate complex social interaction, allows us a further and somewhat more speculative inference: *natural selection is likely to have produced minds that give social information a default weighting advantage over considerations of truth in the “abstract”*.

In the remainder of the paper, I will attempt to justify these two premises and derive their implications for reasoning. I develop the *fitness-oriented* premise through ecological realism and 4E cognition, and integrate these two approaches with the social brain hypothesis (SBH) to justify the *socially embedded* premise through the *principle of social mediation*.

I then outline the implications of these two premises for reasoning via an attempt at an *evolutionary social epistemology*: my epistemic logics framework (ELF) that models the effect of

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different action-relevant criteria on the acceptance and rejection of claims.

Before I proceed, a minor qualification is in order. Conscious agents can represent both truth and fitness abstractly (e.g., truth = claim-world correspondence; fitness = phenotype-niche adaptedness). Once represented in this way, either can become an explicit goal of deliberation via *slow* cognition (in the dual-process sense).

But that is beside the point, as my evolutionary inference regards ordinary, *fast* cognition. The latter (I argue) does not normally adjudicate natural-language statements by separately representing their epistemic and non-epistemic action-relevant characteristics. The lines between the criteria upon which we might accordingly judge statements are instead “blurry” precisely because they are all different proxies for the ultimate goal of viability.

2 Ecological Psychology: Fitness Over Truth, Truth Insofar As It Serves Fitness

What I am provisionally calling the “fitness-orientation hypothesis” is relatively well established in contemporary cognitive science, given the prominence of 4E cognition (*embodied, embedded, enactive, and extended*; [3, 10, 21]).

The 4E model represents a step away from the Cartesian conception of cognition as a detached faculty producing neutral representations of the world. Instead, the contemporary understanding is that cognition is an adaptive orientation system arising from the embodied organism’s active engagement with an environment. As Thompson [17, p. xxv] puts it:

The basic idea of the enactive approach is that . . . cognitive processes belong to the relational domain of the living body coupled to its environment.

The present argument, however, diverges from the enactive approach in one key aspect (despite being broadly in line with it). Instead of rejecting a “pregiven, perceiver-independent world” (cf. [21]) as the reference point for perception, I treat the action-relevant structure of the environment (its *affordances*) as *relational but real*, per Gibson’s [5, p. 133] ecological realist formulation: “an affordance points two ways, to the environment and to the observer”. Action possibilities are present even if unregistered, allowing an agent to misappraise them.

Importantly, while ecological realism does reinterpret perception in terms of fitness-relevant action guidance rather than detached truth representation, successful fitness-tracking nevertheless presupposes sufficient truth-sensitivity (sensitivity to the ecologically relevant structure of the environment).

I formulate this as “fitness over truth, truth insofar as it serves fitness”, which puts me at odds with one of the more prominent *fitness over truth* frameworks in cognitive science, the *interface theory of perception* (ITP), which explicitly disentangles fitness from truth.

The argument, based on evolutionary modeling and genetic algorithms, is that a *non-veridical* perceptual field – a species-specific interface shaped by fitness payoffs – outcompetes a *veridical* one [8].

I emphasize veridicality to highlight the crux of the issue, which is that the ITP mistakenly infers a “deceptive” interface

from fitness-conducive perceptual transformations outperforming perception of the world “as it really is”. This is a mistaken equivocation of *truth* with *veridicality* over *accuracy*. Where the former is about representing the world in its own register (sans interface), the latter entails *satisfactory preservation of the causal structure of the world* (by the interface).

Consider the example of *acidity* (a chemical property) and the taste of *sourness*. Sourness (the “icon”) quite obviously does not capture the essence of acidity (the “code”). And yet, sourness is systematically affected by acid-related variables (such as concentration, pH, anion species; [14]), thus acting as a reliable-enough indicator of the underlying chemical property of acidity.

This is fully in line with the fact that, in an ecological sense, an organism’s environment is a set of constraints and options (broadly, *affordances* per Gibson [5]). These orient need-satisfaction and goal-directed action – an apple is »something to eat« (apprehended via the embodied mechanisms that signal this quality to the organism) before it is »an apple« in the definitional sense (an affordance in the “forum for action” before an object in the “place of things”, to use Petersonian terminology [11]). Objects need not be represented “as they are”, as what is salient is what they *afford*, not what they *are*.

Hence, for perception to be conducive to fitness, it must translate the “distal” environment as it »is« into a set of “proximate” percepts that correlate with the distal action-relevant properties well enough to ensure viability (this is “ecological validity” for Brunswik [1]). Gibson [5] expresses the same necessity as picking up “invariants”: stable relational structures in the organism-environment field that persist across variation and thereby specify actionable affordances.

This is also broadly in line with evolutionary epistemology. Cognition is selected for because it works, and it works because it is at least partially fitted to the causal and statistical structure of the environment [9]. Natural selection does not »care« about truth as such, but it does register the consequences of error, meaning that perception cannot systematically misrepresent aspects of the environment that are relevant for successful action. In this limited but crucial sense, fitness-tracking presupposes tracking truth (in the sense of accurate-structure-representation).

To summarize, from a properly ecological perspective (where how an object interacts with an organism exhausts the significance of “what it is”), perception *must* present an “accurate image”, i.e. an interface that preserves the underlying causal structure with sufficient fidelity to enable successful activity.

The interface may “hide the code”, but it does not mislead the user – except for when it does, as in the case of social interaction and communal life, especially once propositional reasoning and natural language communication enter the picture. We thus attempt to rehabilitate the Hoffman et al. [8] inference by transposing it into the domain of social cognition.

3 Socially Embedded: The Principle of Social Mediation

Having provided a general outline of what will henceforth be referred to as “ecological psychology”, I now shift to one of its underdeveloped implications: what *reasoning* actually *is* for

humans as *evolved* organisms, its relation to *truth*, and how this shapes evolutionary accounts of epistemology.

Let us bring attention to Trivers' [20] strategic self-deception hypothesis:

If . . . deceit is fundamental to animal communication, then there must be strong selection to spot deception and this ought, in turn, to select for a degree of self-deception [implying that] natural selection [might not] favour nervous systems which produce ever more accurate images of the world.

This perspective, along with signaling theory, underlies Simler and Hanson's [13] "hidden motives" framework: self-deception facilitates social deception by allowing agents to pursue norm-violating or self-interested strategies without consciously representing them as such.

This provides a precedent for an analogue of the idea that the icons misrepresent the code to the user in the realm of social cognition. But to understand the underlying ecological logic, we must turn to the SBH and derive the principle of social mediation.

The SBH proposes that human (and primate) cognition evolved to solve adaptive problems (such as acquiring resources for sustenance and avoiding predation) by first solving problems of *social coordination* and *cohesion* (C&C) [4]. Dunbar [4] presents it as a two-step explanation: the proximate mechanism is solving C&C within bonded groups, which enables the solution of the underlying ecological problem (mainly predation and resource gathering).

Leaning on ecological realism, I propose a stronger interpretation. If cognition is designed to produce viable behavioral orientation, and if (in humans) this is most readily achieved by optimizing for solutions to problems of C&C, a primary faculty of our minds must be the ability to navigate social landscapes *before* solving any specific adaptive problem or facilitating abstract reasoning.

If we accept this interpretation, we must also infer that the ecological-realist link between accuracy and fitness can drift under socially mediated conditions. This "social mediation" of agent-environment interaction (by social interaction with other agents and shared rules-of-navigation) changes the environment's affordance structure. The »physical« ecology becomes mediated by the social ecology, creating incentives for cognition to attune to the social-symbolic affordance structure (the causal structure of "social" reality) rather than to the original target (the causal structure of "physical" reality)¹.

This is the basis of my *principle of social mediation*: social organization alters the causal pathway through which an agent encounters and solves an ecological problem. A similar conclusion is reached by Sterelny [15, p. 719], who characterizes social and ecological adaptation as intertwined, given that individuals encounter ecological filters "with others," and with socially accessed technology and information.

To provide an illustrative example, human infants are the clearest case of social mediation of the environment. Infants are, ecologically speaking, not individuals because they lack self-sufficiency. They satisfy their needs and solve adaptive problems wholly through their relationship with their caretakers (in a socially mediated manner).

We can transpose this principle to modern forms of social life and propose that even adults occupy a largely mediated ecology. Rather than ecologically individual, modern adults are embedded in larger political-economic systems that alter the pathway to need-satisfaction and goal-achievement. One crucial aspect is *money* (or exchange media in general), which allows individuals to procure food (and other goods) by participating in activities with monetary returns, instead of getting them directly "from nature".

This changes the causal structure of the problem-domain (from "hunt deer → get food" to "earn money → get food") and consequently also changes the adaptively relevant "slice" of the environment that minds need to accurately "represent" (in the ecological realist view which this paper appropriates). In other words, it is just as important that they represent the causal structure of *nature as socially mediated through rituals, narratives, and social exchange* as it is to represent the causal structure of nature "in itself"².

The implication is that social mediation can create incentives against truth-tracking in reasoning, because truth is not always the most salient criterion within a socially mediated ecology, bringing us to the social epistemological point of this paper.

4 The Inference: The Epistemic Logics Framework

The *epistemic logics* or the *logics of reasoning* are my analytic reconstruction of observable *descriptive* (not normative) criteria of epistemic arbitration that determine distinct "rules of reasoning". In the framework I'm developing, they govern five formal operations. The syntactic operations are *claim acceptance* and *inferential licensing*, whereas the semantic operations are *intension-specification*, *reference* and *predication* (shortened as A, I, S, R, P)³.

Because of scope limitations, I will limit myself to outlining their role in determining acceptance (based on distinct binary criteria) and reference. My usage of "epistemic logic" is distinct from *formal epistemic logic*, the field concerned with the logic of knowledge and belief; but I believe the scope of determination (A, I, S, R, P) of these "rules of reasoning" justifies the term "logic".

Most fundamentally, the "logics" determine what characteristic a proposition must possess to be »accepted as true« or *gain uptake* within a given communicative context. This is the basic qualification for my assertion that the "interface" may

¹ The distinction is functional, rather than ontological. The affordance structure created by interaction with agents is different from the affordance structure created by interaction with objects.

² There is a diachronic aspect to social mediation resulting from the "nested" structure of the human ecology (social subsystems, embedded in a larger social system, itself embedded in the "natural environment"). These mediating systems act as *buffers*, temporarily suspending and modifying selection pressures stemming from the »base layer« of *level-0 constraints*. Strategies that are viable in an

environment unmediated by social interaction become subordinated to strategies adapted to navigating social reality – the »law of the jungle« is replaced by the »law of civilization«. Because the mechanism by which natural selection eliminates error is negative feedback for maladaptive behavior, the buffering effect of social systems allows maladaptive strategies to persist by deferring costs onto the mediating system. The best analogy is a large company with various subsidiaries. A minority of these subsidiaries may represent economic losses, but because the rest are run at a profit, the overall system is capable of sustaining itself.

³ This is elaborated in detail in my work-in-progress doctoral dissertation.

“hide the code” in the domain of social cognition. They are my attempt to formalize patterns deduced from personal observation as well as observed in various philosophical, sociological, and psychological theories into a provisional taxonomy. Due to length constraints, I have mostly omitted these influences in the present paper, as well as the two other premises that properly license the inference to the ELF (*natural language statements as affordance-bearing objects* and Champagne’s [2] *Umwelt normativity*, both addressed in detail in my work-in-progress thesis).

I begin from the basic assumption that, to navigate the complex and dynamic structure of our socially mediated environment, natural selection has equipped humans with fast, context-dependent modes of epistemic filtering that identify a natural language statement’s most salient feature under a given problem structure. The epistemic logics can thus be understood by analogy with Gigerenzer and Goldstein’s [6] fast-and-frugal heuristics: they reduce complexity by isolating one decisive criterion and use it as a ground of acceptance or disqualification.

In my research, I have identified at least four salient domains (and their respective judgment-criteria): *causal constraint-navigation* (truth-as-accuracy), *consensus* (propriety), politics as coalition-building and competition (allegiance), and *hierarchy* (authoritative decision). While the epistemic logics deal with the linguistic instantiation of these domains, they can be reasonably proposed to have a pre-linguistic basis. *Truth as accuracy* corresponds to sensorimotor accuracy: striking a target or hitting a nail on the head. Authoritative decision, propriety and allegiance, on the other hand, all correspond to aspects of social life and group-maintenance.

Authoritative decision corresponds to the social function of hierarchical stratification or »rank ordering«. The pre-linguistic basis of propriety may be found in group-boundary maintenance. *Consensus* (group-agreement) means something is correct for us (“our group”), rather than “objectively” correct, but it is often naturalized into the latter. Territorial markers separate “us” from “them”, and the same affective machinery that regulates pathogen avoidance may also contribute to moralized aversion toward outsiders, as proposed by the moral foundations theory and parasite-stress theory [7, 18]. *Allegiance* is likewise rooted in distinguishing between “us” and “them”, but related to jockeying for advantage through coalitional politics and actively maintaining boundaries (rather than simply establishing them).

When transposed onto the level of propositional reasoning, these translate to the logic of *reason* (truth), *politics* (allegiance), *power* (authoritative decision), and *normativity* (propriety). Each of these logics, as strategies for reasoning about the acceptability of claims, is based on a binary criterion:

- *Reason* → accept/reject claim *iff* claim is true/false
- *Normativity* → accept/reject claim *iff* claim is proper/improper (per operative moral standard)

- *Politics* → accept/reject claim *iff* claim is aligned/adversarial (per coalition's current agenda)
- *Power* → accept/reject claim *iff* claim is authorized/forbidden (by sovereign decision)

There is a fifth, meta-logic: the *logic of survival*, operating by the criterion of pragmatic utility or viability. It differs from the others because of its dual status. *Synchronically*, it functions as a meta-heuristic that selects among the other logics (reasoning modules) according to the demands of the present ecological situation. *Diachronically*, however, it functions as a Darwinian-pragmatic filter by subjecting different modes of reasoning to natural selection by their consequences. Those that continue to produce viable outcomes under real ecological constraints are selected in favor of others; thus, »proving« their outputs to have been »true« in a Darwinian sense.

This is also what ultimately makes the logic of reason indispensable. Social mediation turns individual empirical observation and rational deliberation into an inefficient alternative to inference from different social cues, but the possibility of an unmediated affordance structure re-imposing itself on the individual organism should necessitate a »module« for orientation in such a context⁴.

The four binary criteria establish the syntax of the “rules of reasoning” determined by the logic operative in a given social context. The semantics *follows from the syntax* and, for the present paper, concerns the operative *regime of reference*, determining which object-label attachments are legitimate, briefly outlined below.

Under the logic of reason, reference works by *denotation*: the name must match the empirical properties of the object. An apple is an “apple” if it fits the descriptive definition grounded in observation.

Under normativity, reference works by *connotation*: X is <evaluatively charged term> if both share the same evaluative coding in the operative discursive context (regardless of match or mismatch between conventional definition and empirical properties)⁵. A discursive phenomenon characteristic of the logic of normativity is the disqualification of truth claims because of their »improper« (or politically incorrect) nature, regardless of or despite empirical evidence in their favor⁶.

The logic of politics determines reference on the basis of allegiance: a label is applied when it is beneficial to one’s agenda, withheld when it is detrimental (in this sense, it is partially entwined with the logic of normativity, as the latter is often the backdrop determining the utility of the label based on its evaluative load).

The logic of power is an interesting special case in that it is arbitrary rather than algorithmic, unlike the other three (which can be neatly formalized as strict rules). Its referential regime is decisionist in that the sovereign’s act of naming (or suspending a name) makes it “real”, creating X out of not-X, even if this contradicts any of the other referential regimes. This,

⁴ I am using “truth” in an ecological sense as accurate representation of the causal structure of distal reality, which corresponds most closely to socially unmediated observation and deliberation. The other criteria (propriety, cost-benefit, and authority) are often more efficient than direct inquiry, but less reliably coupled to the causal structure of distal reality due to social mediation and cost-buffering. Only direct inquiry and individual judgment are directly answerable to environmental feedback. Furthermore, module is used loosely, rather than in the strong massive modularity sense.

⁵ I elaborate at length on the difference between denotative and connotative reference (descriptive versus evaluative determinacy, to be precise) in a different manuscript.

⁶ I discuss this as “moralistic argumentation” in a previous paper.

coincidentally, is how Strong [16] characterizes the Hobbesian-Schmittian sovereign in his foreword to the English translation of *Political Theology*.

The logic of power is »anti-logical«, as it suspends epistemic adjudication and reference regimes in particular cases (creating particular exceptions) while preserving them in general. To use a trivial, non-representative but clearly intelligible case: if there is a clear-cut rule for what counts as “fruit”, an arbitrary break in the social attribution of “fruit-status” to a specific class of object indicates the logic of power at play. Less trivially, a rule for social acceptance of claims (as true) not applying to one class of statement within a shared “family of resemblance” or one specific group of speakers, similarly indicates the logic of power.

Besides syntax and semantics, there is also the domain of pragmatics, through which the operative logic of a discursive context is made legible. One cannot determine meaning-in-practice by consulting a dictionary or reasoning from first principles. Instead, it is done by observing social reactions to the assertion of truth claims and the attachment of labels. If the behavioral consequences of a positive or negative designation match expectations, then the label is *socially true*, regardless of whether it is “literally” true. Likewise, if a statement is accepted as true based on a non-truth criterion and despite empirical evidence to the contrary, it is *socially true*.

In this sense, the logics operate socially (at the level of *discourse*) and individually (at the level of *reasoning*). The former refers to the communicative norms of a given social context, while the latter refers to how individuals privately judge truth claims (whether there is a clear line between the two is something I have not yet been able to determine with full confidence).

In summary, truth, as commonly understood, is only one possible criterion by which humans judge descriptive claims that lead to their uptake in communicative contexts. It is also *weakest*: generally overwritten by its fast and frugal alternatives because of its slow and expensive nature.

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Povezanost Med Vrstniškimi Odnosi v Adolescenci in Socialno Anksioznostjo v Odraslosti

The Relationship Between Peer Relationships In Adolescence And Social Anxiety In Adulthood

Eva Ribič, mag. biopsih.

Oddelek za psihologijo

DOBA fakulteta

Maribor, Slovenija

eva.ribic@net.doba.si

Doc. dr. Adela Černigoj

Oddelek za psihologijo

DOBA fakulteta

Maribor, Slovenija

adela.cernigoj@net.doba.si

Doc. dr. Marko Divjak

Oddelek za psihologijo

DOBA fakulteta

Maribor, Slovenija

marko.divjak@net.doba.si

Abstract / Povzetek

Adolescenca je kritično obdobje za oblikovanje identitete, v katerem sta sprejemanje in potrditve s strani vrstnikov bistvenega pomena. Odnosi, ki se vzpostavijo z vrstniki v tem obdobju, lahko vplivajo na to, kako se posamezniki spopadajo s stresnimi situacijami in se prilagajajo življenju v odrasli dobi [8]. Namen te študije je bil raziskati, kako odnosi z vrstniki, zlasti ustrahovanje, vplivajo na razvoj socialne anksioznosti v odrasli dobi, in raziskati vlogo zaščitnih dejavnikov, kot so pozitivni družinski odnosi. Kvantitativni podatki so bili zbrani s spletno anketo z uporabo Retrospektivnega vprašalnika o ustrahovanju [19], Lestvice anksioznosti zaradi socialne interakcije [12] in Večdimenzionalne lestvice zaznane socialne podpore [24]. V študiji je sodelovalo skupno 145 posameznikov, starih od 25 do 35 let (80,7 % žensk). Za preverjanje hipotez so bili uporabljeni t-test neodvisnih vzorcev, enosmerna analiza variance (ANOVA) in ordinalna logistična regresija z interakcijo. Ugotovitve so pokazale, da so izkušnje z ustrahovanjem v adolescenci, vključno s pogostostjo in zaznano resnostjo teh izkušenj, pomembno povezane z višjo stopnjo socialne anksioznosti v odrasli dobi. Poleg tega so rezultati pokazali, da so ženske poročale o višji stopnji socialne anksioznosti kot moški, medtem ko blažilni učinek zaznane družinske podpore ni bil statistično značilen. Ugotovitve prispevajo k boljšemu razumevanju dejavnikov tveganja, povezanih z razvojem socialne anksioznosti, in zagotavljajo osnovo za razvoj preventivnih programov, namenjenih zmanjšanju nasilnega vedenja med mladostniki.

Ključne besede

Vrstniški odnosi, adolescenca, socialna anksioznost, medvrstniško nasilje, poster.

Abstract

Adolescence is a critical period for identity formation, during which acceptance and validation from peers are essential.

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Relationships formed with peers during this period can influence how individuals handle stressful situations and adapt to life in adulthood [8]. This study aimed to investigate how peer relationships, specifically bullying influence the development of social anxiety in adulthood and to explore the role of protective factors, such as positive family relationships. Quantitative data were collected through an online survey, using The Retrospective Bullying Questionnaire [9], the Social Interaction Anxiety Scale [12] and the Multidimensional Scale of Perceived Social Support [24]. A total of 145 individuals aged 25 to 35 participated in the study (80,7 % woman). Independent samples t-test, one-way analysis of variance (ANOVA), and ordinal logistic regression with interaction were used to test the hypotheses. The findings revealed that experiences of bullying during adolescence, including the frequency and perceived severity of these experiences were significantly linked to higher levels of social anxiety in adulthood. Furthermore, the results indicated that women reported higher levels of social anxiety than men, while the moderating effect of perceived family support was not statistically significant. The findings contribute to a better understanding of the risk factors associated with the development of social anxiety and provide a basis for the development of preventive programs aimed at reducing bullying behaviour among adolescents.

Keywords

Peer relationships, adolescence, social anxiety, peer bullying, poster.

1 Ozadje problema

Adolescenca je obdobje med otroštvom in odraslostjo, v katerem prihaja do intenzivnega razvoja posameznika ter oblikovanja lastne identitete in samopodobe [18]. To obdobje zaznamujejo pomembne telesne, čustvene in kognitivne spremembe, zato predstavlja čas intenzivnega dozorevanja posameznika, ki poleg spolnega razvoja vključuje tudi druge pomembne spremembe v mišljenju, čustvovanju in v socialnem funkcioniranju [2, 4, 18, 20]. Poleg tega se pri posamezniku povečata potreba po avtonomiji od staršev in želja po pripadnosti vrstnikom [23]. Tako socialne izkušnje v tem obdobju niso le prehodne, ampak lahko pomembno oblikujejo dolgoročne vzorce delovanja v odnosih in duševno zdravje v odraslosti [10].

Vrstniški odnosi imajo pomembno vlogo pri razvoju posameznika, saj mladostnik v vrstniški skupini išče pripadnost,

podporo in potrditev [12]. Vrstniški odnosi v adolescenci predstavljajo enega najpomembnejših delov pri socialnem razvoju. Pri mladostniku se ob druženju in socialni interakciji z vrstniki oblikujejo občutki, da družbi pripada, hkrati pa se oblikujejo posameznikove vloge, ki jih prevzema v družbi in s tem oblikuje lastno identiteto. Raziskave navajajo, da imajo kakovostni vrstniški odnosi pomembno vlogo pri ustrezni psihološki regulaciji v družbi, razvoju sposobnosti empatije do drugih in pri duševnem zdravju odrasle osebe [2, 21]. Odnosi, ki se oblikujejo v skupini vrstnikov, vplivajo na odzive in zmožnost psihosocialnega prilagajanja tudi pozneje v odraslosti [12]. Izkušnja ustrahovanja, izključevanja in zasmehovanja tako lahko poveča tveganje za razvoj socialne anksioznosti v odraslosti [2, 7].

Socialna anksioznost oziroma močan strah pred ocenjevanjem družbe, občutek neugajanja in pomanjkanje pripadnosti ter posledično izogibanje socialnim interakcijam so negativne posledice vrstniških skupin, ob katerih posameznik pridobi slabe izkušnje in ne dobi lastne potrditve vrstniške skupine [16]. Simptomi socialne anksioznosti se pogosto pojavijo že v adolescenci, ko postanejo medosebni odnosi in socialno vrednotenje vrstnikov pomembnejši [9]. Obdobje adolescence je zaznamovano z večjo občutljivostjo na odzive socialnega okolja, kar lahko poveča tveganje za razvoj strahu pred negativnim vrednotenjem [22]. Že Bowlby [13] in Ainsworth [14] sta poudarjala teorijo navezanosti, ki daje velik pomen zgodnjim odnosom posameznika s socialno okolico, na podlagi katerih se oblikujeta posameznikovo vedenje in odnos do drugih. Socialna anksioznost izvira iz vrstniških izkušenj, najmočnejše pa se izrazi v zgodnji odraslosti, v obdobju po 25. letu starosti [17].

Diagnostična merila socialne anksiozne motnje vključujejo izrazit in trajen strah pred eno ali več socialnimi situacijami, v katerih je posameznik izpostavljen mogoči presoji drugih ljudi. Posamezniki se bojijo, da bo njihovo vedenje nerodno ali, da bodo pokazali znake anksioznosti, ki bi lahko pripeljali do negativnega vrednotenja in poniževanja na strani drugih. Socialne situacije skoraj vedno izzovejo intenziven anksiozen odziv, zato se jim posamezniki pogosto izogibajo ali jih prenašajo z izrazitim nelagodjem. Za postavitev diagnoze morajo simptomi trajati vsaj šest mesecev in pomembno vplivati na posameznikovo vsakodnevno funkcioniranje [3].

Ženske v primerjavi z moškimi v povprečju poročajo o višjih ravneh depresije oziroma imajo večjo pojavnost depresije v različnih življenjskih obdobjih [15, 10]. Dekleta in ženske prav tako praviloma poročajo o višjih ravneh socialne anksioznosti v adolescenci in odraslosti. Razlike med spoloma v izraženosti socialne anksioznosti so lahko povezane z različnimi socialnimi in psihološkimi dejavniki, med katerimi literatura izpostavlja tudi izkušnje medvrstniškega nasilja [1, 6, 15]. Nekatere študije kažejo, da ima medvrstniško nasilje močnejši vpliv na razvoj socialne anksioznosti pri dekletih kot pri fantih. Kot ena od možnih razlag se navaja večja usmerjenost deklet k medosebnim odnosom in socialni sprejetosti, zaradi česar so lahko občutljivejša na negativne socialne izkušnje, kot je medvrstniško nasilje. Negativne izkušnje, do katerih pripelje medvrstniško nasilje, lahko pri dekletih močnejše vplivajo na samopodobo in pričakovanje socialnega vrednotenja, kar bi lahko prispevalo k večjemu tveganju za razvoj socialne anksioznosti. Poleg tega se stiske pri dekletih pogostejše izražajo v obliki internalizacijskih težav, medtem ko so pri fantih relativno pogostejši

eksternalizacijski odzivi, kar bi lahko deloma prispevalo k razlikam v izraženosti socialne anksioznosti [15]. Hkrati nekatere ugotovitve nakazujejo, da ima lahko socialna anksioznost, povezana z izkušnjo medvrstniškega nasilja, pomembne posledice za poznejše socialne odnose tudi pri fantih, zato razlik med spoloma ni mogoče razumeti enoznačno [1, 6, 15].

1.1 Cilji raziskovalnega problema

Namen študije je bil raziskati povezavo med izkušnjo medvrstniškega nasilja v adolescenci ter izraženostjo socialne anksioznosti v odraslosti. Natančneje, cilj te študije je bil odgovoriti na naslednja vprašanja: (1) Ali se stopnja socialne anksioznosti v odraslosti razlikuje glede na izkušnjo medvrstniškega nasilja v adolescenci; (2) ali obstajajo statistično značilne razlike med moškimi in ženskami z izkušnjo vrstniškega nasilja v adolescenci in izraženo socialno anksioznostjo v odraslosti ter (3) kakšen je vpliv zaznane družinske podpore na odnos med izkušnjo medvrstniškega nasilja v adolescenci in izraženostjo socialne anksioznosti v odraslosti?

2 Metode

Empirični del je temeljil na presečnem, kvantitativnem raziskovalnem pristopu, z namenom pridobiti dejanske podatke na množici ljudi, katere značilnosti so ustrezale postavljenim merilom. Podatki so bili zbrani s pomočjo spletnega vprašalnika s priložnostnim vzorčenjem preko družbenih omrežij in z veriženjem preko osebnih kontaktov. Skupno je v raziskavi sodelovalo 145 oseb, starih od 25 do 35 let (80,7 % žensk). Uporabljeni so bili Retrospektivni vprašalnik ustrahovanja [19], Lestvica socialne interakcijske anksioznosti [12] in Večdimenzionalna lestvica zaznane socialne podpore [24]. Za preverjanje hipotez so bili uporabljeni t-test za neodvisne vzorce, enosmerna analiza variance (ANOVA) in ordinalna logistična regresija z interakcijo.

3 Rezultati

Rezultati so pokazali da so udeleženci, ki so v adolescenci pogostejše doživljali medvrstniško nasilje ter tisti, ki so svojo izkušnjo nasilja ocenjevali kot bolj resno, poročali o pomembno višjih ravneh socialne anksioznosti. Posamezniki, ki so poročali o izkušnji medvrstniškega nasilja v adolescenci, so v odraslosti kazali višjo stopnjo izraženosti socialne anksioznosti v primerjavi z osebami brez takšnih izkušenj. Rezultati raziskave so skladni s pregledano literaturo, ki poudarja pomembno vlogo negativnih socialnih izkušenj pri razvoju socialne anksioznosti. Posamezniki, ki so v adolescenci pogosto doživljali zavračanje, izključevanje ali poniževanje na strani vrstnikov, lahko začno razvijati negativna prepričanja o sebi, ki se lahko ohranijo tudi pozneje v odraslosti. Ponavljajoče se negativne socialne izkušnje pomembno vplivajo na psihološko funkcioniranje posameznika. Za medvrstniško nasilje je značilna ponavljajoča se narava vedenja, zaradi katere posameznik razvija občutek nemoči, negotovosti in zmanjšane socialne varnosti, večkratna izpostavljenost medvrstniškemu nasilju pa lahko okrepi občutke sramu, socialne neustreznosti in pričakovanja zavrnitve [19]. Posamezniki se začnejo izogibati socialnim interakcijam, kar

zmanjšuje možnost pozitivnih socialnih izkušenj in dolgoročno ohranja socialno anksioznost [5]. Posamezniki, ki so svoje izkušnje medvrstniškega nasilja doživljali kot resnejše oziroma so jim bile bolj obremenjujoče, so izražali višjo stopnjo socialne anksioznosti v odraslosti. Na razvoj psiholoških posledic ne vpliva samo objektivna prisotnost medvrstniškega nasilja, ampak predvsem način, kako posameznik takšne izkušnje subjektivno doživlja in predeluje. Dve osebi lahko podobno izkušnjo doživita zelo različno, pri čemer imajo pomembno vlogo osebnostne značilnosti, samopodoba, socialna podpora in pretekle izkušnje [11]. Posamezniki, ki določene izkušnje zaznavajo kot zelo ponižujoče ali ogrožajoče, lahko razvijejo močnejši strah pred socialnim vrednotenjem in povečano občutljivost na socialne grožnje. Subjektivno doživljanje medvrstniškega nasilja predstavlja pomemben dejavnik pri razumevanju razvoja socialne anksioznosti.

Med udeleženci z izkušnjo medvrstniškega nasilja so ženske poročale o višji stopnji socialne anksioznosti kot moški. Ženske so v povprečju dosegale višje rezultate na lestvici socialne anksioznosti v primerjavi z moškimi, kar kaže na višjo stopnjo izraženosti socialne anksioznosti pri ženskah z izkušnjo medvrstniškega nasilja v adolescenci. Raziskave poudarjajo, da so mladostnice pogosto občutljivejše na kakovost socialnih odnosov, odzive vrstnikov in na socialno vrednotenje. Negativne medvrstniške izkušnje zato pri ženskah pogosteje vplivajo na razvoj občutkov manjvrednosti, povečane samokritičnosti in strahu pred zavrnitvijo. Mladostnice so pogosto bolj usmerjene v kakovost medosebnih odnosov in socialno sprejetost, zato imajo negativne socialne izkušnje nanje izrazitejši čustveni vpliv. K temu prispevajo tudi družbena pričakovanja in večja občutljivost na socialno primerjanje ter odzive okolice [15].

Višja zaznana družinska podpora je bila pomemben napovednik nižje stopnje socialne anksioznosti, vendar pa interakcijski učinek med medvrstniškim nasiljem in družinsko podporo pri napovedovanju anksioznosti ni bil statistično značilen. Ob sočasnem upoštevanju učinkov medvrstniškega nasilja in zaznane družinske podpore se kot pomembnejši napovednik socialne anksioznosti v odraslosti izkaže družinska podpora. Čeprav so posamezniki z višjo zaznano družinsko podporo v povprečju izražali nekoliko nižjo stopnjo socialne anksioznosti, rezultati niso pokazali statistično značilnega učinka družinske podpore pri zmanjševanju vpliva medvrstniškega nasilja na poznejšo izraženost socialne anksioznosti. Družinska podpora sama po sebi ni zadosten zaščitni dejavnik pri zmanjševanju dolgoročnih učinkov medvrstniškega nasilja na razvoj socialne anksioznosti. Dobljeni rezultati so skladni z nekaterimi raziskavami, ki opozarjajo, da je vpliv družinske podpore kompleksnejši in da imajo lahko različne oblike podpore različen vpliv na posameznika [1]. Mogoče je, da posamezniki kljub prisotni družinski podpori negativne medvrstniške izkušnje internalizirajo in jih doživljajo kot pomemben pokazatelj lastne socialne vrednosti. Ker je v adolescenci socialno vrednotenje vrstnikov posebej pomembno, lahko negativne izkušnje z vrstniki pomembno vplivajo na razvoj negativne samopodobe in strahu pred zavrnitvijo – ne glede na kakovost družinskih odnosov. Rezultati raziskave tako kažejo, da družinska podpora sicer predstavlja pomemben dejavnik psihološkega blagostanja, vendar v naši raziskavi ni imela statistično pomembnega učinka pri zmanjševanju vpliva vrstniškega nasilja na izraženost

socialne anksioznosti v odraslosti. Pomembno je poudariti tudi dejstvo, da se izkušnja medvrstniškega nasilja v regresijskem modelu ni izkazala za statistično značilen napovednik socialne anksioznosti, čeprav so predhodne analize pokazale, da so udeleženci z izkušnjo medvrstniškega nasilja v povprečju dosegali višje rezultate na lestvici socialne anksioznosti kot tisti brez takšne izkušnje. Neskladje med ugotovitvami je mogoče pojasniti z razlikami med uporabljenimi statističnimi pristopi. T-test omogoča primerjavo povprečnih vrednosti med dvema skupinama, ne upošteva pa vpliva drugih dejavnikov, ki lahko hkrati prispevajo k razvoju SA. Regresijska analiza pa ocenjuje prispevek posameznega napovednika ob sočasnem upoštevanju drugih spremenljivk v modelu. V naši raziskavi je bila v model vključena tudi zaznana družinska podpora, ki se je izkazala za pomemben negativen napovednik socialne anksioznosti. To nakazuje, da lahko del variabilnosti socialne anksioznosti pojasnjuje prav družinska podpora. Posamezniki, ki so bili izpostavljeni medvrstniškemu nasilju, so lahko hkrati poročali o nižji ravni družinske podpore, pri čemer je prav ta dejavnik pomembneje prispeval k pojasnjevanju razlik v stopnji socialne anksioznosti. Dobljeni rezultati zato ne pomenijo, da izkušnja medvrstniškega nasilja ni povezana z višjo stopnjo socialne anksioznosti, ampak kažejo, da njen neposredni prispevek ob upoštevanju družinske podpore ni več statistično značilen.

4 Zaključki

Ta študija je ugotovila: (1) da obstaja statistično pomembna razlika med udeleženci z izkušnjo medvrstniškega nasilja v adolescenci in tistimi brez izkušnje medvrstniškega nasilja v odraslosti, in sicer v stopnji izraženosti socialne anksioznosti v odraslosti. Pri tem se je ugotovilo, da se stopnja izraženosti socialne anksioznosti v odraslosti statistično značilno razlikuje glede na pogostost doživljanja medvrstniškega nasilja v adolescenci in glede na zaznano resnost medvrstniškega nasilja; (2) da so ženske v primerjavi z moškimi dosegale višje rezultate na lestvici socialne anksioznosti in (3) da na uporabljenem vzorcu interakcija med družinsko podporo in medvrstniškim nasiljem pri napovedovanju socialne anksioznosti ni bila statistično značilna.

Ugotovitve raziskave kažejo, da pri razlagi izraženosti socialne anksioznosti v odraslosti ni pomembna samo prisotnost ali odsotnost medvrstniškega nasilja, ampak tudi njegova pogostost in zaznana resnost. Ugotovitve prispevajo k boljšemu razumevanju dejavnikov tveganja, povezanih z razvojem socialne anksioznosti, in predstavljajo osnovo za razvoj preventivnih programov, namenjenih preprečevanju medvrstniškega nasilja med mladostniki. Ugotovljena povezava med medvrstniškim nasiljem v adolescenci in izraženostjo socialne anksioznosti v odraslosti kaže, da negativne izkušnje v obdobju odraščanja ne vplivajo samo na trenutno psihološko zdravje posameznika, ampak lahko pomembno zaznamujejo tudi njegovo poznejše socialno funkcioniranje. Adolescenca predstavlja obdobje, v katerem posamezniki oblikujejo svojo identiteto, razvijajo občutek lastne vrednosti in vzpostavljajo pričakovanja glede medosebnih odnosov. Negativne izkušnje v tem obdobju imajo zato večjo težo kot podobne izkušnje v poznejših življenjskih obdobjih.

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It's all in the mind: regression analysis of appearance satisfaction, conscientiousness and age based on resting state EEG data

Petra Šurla Toth

University of Primorska, Faculty of
Mathematics, Natural Sciences and
Information Technologies
Koper, Slovenia
petra.surla@gmail.com

Jakob Sajovic

University of Primorska, Faculty of
Mathematics, Natural Sciences and
Information Technologies
Koper, Slovenia
University Medical Centre Ljubljana,
Division of Stomatology
Ljubljana, Slovenia

Peter Rogelj

University of Primorska, Faculty of
Mathematics, Natural Sciences and
Information Technologies
Koper, Slovenia

Abstract

Satisfaction with appearance is an important part of psychosocial well-being, especially in young people with cleft lip and/or palate. Facial differences can affect how they see themselves and how they interact with others. This study evaluated whether resting-state electroencephalography (EEG) connectivity contains sufficient information to estimate satisfaction with appearance. It also tested whether prediction accuracy differs between psychological and objective personal characteristics. Appearance satisfaction, conscientiousness, and age were considered as three target variables with different expected levels of prediction difficulty.

Resting-state EEG recordings from 54 adolescents with cleft lip and/or palate were analysed. The seven-minute recordings were collected with eyes closed using 32 EEG channels and divided into 10-second segments. Functional and effective connectivity features were calculated using four methods: phase-locking value (PLV), weighted phase lag index (wPLI), complex Pearson correlation coefficient (CPCC), and Granger causality (GC). The 10% most relevant features were selected using minimum redundancy maximum relevance method, and linear support vector regression models were evaluated using two data-splitting approaches.

In the intersubject analysis, participants in the training and test sets were completely separated, whereas in the intrasubject analysis, segments from the same participant could occur in both sets. The intrasubject models achieved positive test-set R^2 values for all three target variables, with CPCC providing the best overall performance. However, all intersubject test-set R^2 values were negative. These results suggest that resting-state EEG contains information related to the target variables, but the models did not perform well on new participants. These findings show the importance of participant-independent testing when evaluating EEG-based prediction models.

Keywords

EEG, cleft lip and/or palate, satisfaction with appearance, CHASQ, conscientiousness, brain activity, functional connectivity, PLV, wPLI, CPCC, GC, intersubject analysis, intrasubject analysis

1 Introduction

Young people with cleft lip and/or palate may experience difficulties with speech, hearing, and feeding, as well as emotional and social challenges related to their appearance. Satisfaction with appearance can affect self-image and social life. However, it cannot be explained only by the presence or severity of a visible facial difference. Previous studies [8] have shown that dissatisfaction with appearance is linked to emotional and social difficulties, but it is still not clear which factors influence why some young people are more satisfied with their appearance than others. This suggests that appearance satisfaction is shaped by a combination of psychological, social, and developmental factors [8].

Because clinical outcomes do not fully reflect a person's own experience, patient-reported outcome measures can provide important additional information. One such measure is the Cleft Hearing, Appearance and Speech Questionnaire (CHASQ), which allows young people with cleft lip and/or palate to report their satisfaction with appearance, hearing, and speech. This also raises the question of whether individual differences in appearance satisfaction can be reflected in measurable patterns of brain activity.

To explore this question, electroencephalography (EEG) can be used as a non-invasive method for measuring electrical brain activity with high temporal resolution [2]. Brain connectivity analysis can further describe relationships between signals recorded from different brain regions. Different connectivity measures can therefore capture different aspects of these relationships [5]. Phase-locking value (PLV) measures phase synchronisation [1], while weighted phase lag index (wPLI) is less sensitive to volume conduction and noise [17]. Complex Pearson correlation coefficient (CPCC) provides information about complex relationships between analytic EEG signals [14], while Granger causality (GC) measures directed predictive relationships between time series [12].

The main research question of this study was whether functional and effective brain-connectivity features derived from resting-state EEG can be used to estimate appearance satisfaction, conscientiousness, and age.

The three target variables were selected to represent different expected levels of prediction difficulty. Appearance satisfaction was considered the most complex target because it is a subjective psychological construct affected by several developmental and psychosocial factors. Conscientiousness represented an intermediate level as a personality trait, while age was considered the simplest because it can be measured directly.

Accordingly, the following hypotheses were evaluated:

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- **H1:** Appearance satisfaction can be estimated from functional and effective connectivity features derived from resting-state EEG.
- **H2:** Conscientiousness can be estimated from functional and effective connectivity features derived from resting-state EEG.
- **H3:** Age can be estimated from functional and effective connectivity features derived from resting-state EEG.

An important part of the study was comparing intersubject and intrasubject evaluation. This comparison showed whether patterns found in EEG data could also be used for new participants or were mainly specific to individual participants.

2 Methodology

The data were obtained from a previous study conducted at the University Medical Centre Ljubljana [11]. The sample included 54 adolescents with cleft lip and/or palate, including 23 females and 31 males. Participants were between 11.67 and 18.31 years old, with a mean age of 14.72 years.

Our three target variables were included in the analysis. Appearance satisfaction was measured using a 15-item version of the CHASQ questionnaire, where higher scores indicated greater satisfaction. Conscientiousness was obtained from the VMR-OM personality questionnaire, while age was used as the third target variable.

For each participant, seven minutes of resting-state EEG with closed eyes were analysed. EEG was recorded using a g.Tec system with 32 wet electrodes positioned according to the 5–10 electrode placement system, with a sampling frequency of 500 Hz [10].

The recordings were processed in MATLAB [3] and divided into non-overlapping 10-second segments. Connectivity matrices were calculated independently for each segment using PLV, wPLI, CPCC, and GC.

PLV and wPLI produced 496 connectivity features. CPCC included both the absolute value and imaginary component and therefore produced 992 features. GC measures directed relationships between channels and therefore also produced 992 features.

Because each participant had a single value for each target variable, the corresponding appearance satisfaction, conscientiousness, or age value was assigned to all EEG segments belonging to that participant. Since the number of connectivity features was large, the minimum redundancy maximum relevance (MRMR) algorithm was used to rank them [13]. The top 10% of features were retained, and feature selection was performed only on the training data.

After feature selection, linear support vector regression models were trained. The data were standardised and model hyperparameters were optimised [7, 4]. For model evaluation, the data were divided into 70% training and 30% testing subsets using two different approaches: intersubject and intrasubject analysis.

In the *intersubject analysis*, participants were divided between the training and test sets. All segments from the same participant were therefore kept in only one set. This approach was used to test whether the model could generalise to new participants who were not included in the training data.

In the *intrasubject analysis*, individual EEG segments were randomly divided between the training and test sets. As a result, segments from the same participant could appear in both sets. This approach was used to evaluate the model's performance on unseen EEG segments.

Finally, model performance was evaluated using root mean square error (RMSE) [6], the coefficient of determination (R^2), and adjusted R^2 [15].

3 Results

Table 1 shows the test results for all three target variables, four connectivity methods, and both analysis approaches.

A clear difference was observed between the two analysis approaches. In the intrasubject analysis, all test-set R^2 values were positive. CPCC consistently achieved the strongest overall performance across all three target variables. For appearance satisfaction, CPCC achieved RMSE = 14.59, R^2 = 0.734, and adjusted R^2 = 0.688. For age, the corresponding values were RMSE = 1.08, R^2 = 0.622, and adjusted R^2 = 0.554. For conscientiousness, the results were RMSE = 1.04, R^2 = 0.768, and adjusted R^2 = 0.728.

The intersubject analysis showed different results. All test-set R^2 and adjusted R^2 values were negative for all three target variables and all four connectivity methods. Negative R^2 values mean that the model performed worse than simply predicting the mean value of the target variable for all cases. This indicates that the models were not able to reliably estimate the target variables for new participants. For appearance satisfaction, wPLI produced the lowest test RMSE of 26.62 and the least negative R^2 of -0.205 . For conscientiousness, wPLI again had the lowest RMSE of 2.86 and the least negative R^2 of -1.027 . For age, wPLI produced the lowest RMSE of 2.09, while GC obtained the least negative R^2 of -0.545 .

CPCC showed the best overall performance in the intrasubject analysis, while wPLI performed best in the intersubject analysis. GC showed the poorest performance on new participants.

4 Discussion

The main finding of this study was the clear difference between the intersubject and intrasubject analyses. In the intrasubject analysis, the models achieved positive R^2 values for all three target variables. However, when participants in the training and test sets were completely separated, all test-set R^2 values were negative.

The positive intrasubject results show that the EEG segments contain information related to appearance satisfaction, conscientiousness, and age. Still, these patterns were not stable enough to generalise to new participants. For this reason, the intersubject analysis was more important for evaluating the hypotheses. Since all test-set R^2 values were negative, none of the three hypotheses was confirmed in the intersubject analysis. **H1**, which assumed that appearance satisfaction could be estimated from resting-state EEG connectivity features, was not confirmed. **H2**, concerning the estimation of conscientiousness, and **H3**, concerning age, were also not confirmed.

The problem with generalisation was not limited to appearance satisfaction. Similar results were found for conscientiousness and age. This suggests that the main difficulty was not only the complexity of the target variables, but also the ability of the models to find patterns that remain stable across different participants.

This is also seen in the results for conscientiousness, which are similar to those reported by Korjus et al. [9]. Their study found that Big Five personality traits could not be reliably predicted from resting-state EEG [9]. Although a different approach was

Table 1: Test results of the regression models

Target	Method	Intersubject			Intrasubject		
		RMSE	R^2	Adj. R^2	RMSE	R^2	Adj. R^2
CHASQ	PLV	37.75	-1.423	-1.624	21.22	0.457	0.412
	wPLI	26.62	-0.205	-0.305	24.87	0.208	0.144
	CPCC	40.32	-1.765	-2.259	14.59	0.734	0.688
	GC	86.34	-11.675	-13.940	17.96	0.590	0.518
Age	PLV	2.61	-1.794	-2.026	1.27	0.481	0.437
	wPLI	2.09	-0.634	-0.769	1.64	0.110	0.035
	CPCC	2.40	-1.309	-1.721	1.08	0.622	0.554
	GC	29.88	-0.545	-0.821	21.08	0.441	0.341
Conscientiousness	PLV	3.67	-2.411	-2.694	1.31	0.616	0.584
	wPLI	2.86	-1.027	-1.195	1.84	0.237	0.175
	CPCC	3.87	-2.717	-3.381	1.04	0.768	0.728
	GC	86.82	-10.321	-12.344	17.55	0.597	0.527

used, the results were similar. This suggests that conscientiousness is difficult to predict from EEG, especially when the model is tested on new participants.

The findings for age showed a different pattern. Vandenbosch et al. [16] successfully predicted age from resting-state EEG in children and adolescents [16]. Their study included 1538 participants and a wider age range, while our study included a much smaller group and a narrower age range. These differences may have made age prediction more difficult in our analysis.

Among the connectivity methods, CPCC showed the best overall performance in the intrasubject analysis. One possible reason is that CPCC includes both the absolute value and the imaginary component of complex connectivity, which provides more information about relationships between EEG signals [14]. However, these results did not generalise well to new participants. In the intersubject analysis, wPLI performed best, while GC showed the largest errors and the poorest generalisation to new participants.

One of the main limitations of this study was the relatively small number of participants compared with the large number of EEG connectivity features. Although MRMR was used to reduce the number of features, differences between participants were still difficult to model.

Future studies should first repeat the analysis with a larger sample, because a larger dataset is necessary for more reliable intersubject modelling. Once enough data are available, other feature-selection methods and machine-learning models could be tested. Different EEG segment lengths and modified connectivity estimation methods could also be explored.

5 Conclusion

This study examined whether functional and effective connectivity features from resting-state EEG can be used to estimate appearance satisfaction, conscientiousness, and age in adolescents with cleft lip and/or palate. Four connectivity methods and two different evaluation approaches were compared.

The results showed that model performance strongly depended on how the data were divided. Intrasubject analysis produced positive results for all three target variables, with CPCC showing the best overall performance. Still, the models did not generalise successfully to new participants, as all intersubject test-set R^2 values were negative.

The proposed hypotheses were therefore not supported in the intersubject analysis. Nevertheless, the positive intrasubject results indicate that resting-state EEG contains patterns related to the investigated characteristics. These patterns, however, were not stable enough to generalise reliably to new participants.

An important contribution of this study is the comparison between intersubject and intrasubject analysis. The results show that good performance on new EEG segments from previously seen participants does not necessarily mean that the model will also perform well on completely new participants. This difference is important when interpreting the results of EEG-based prediction models.

Overall, the results provide a useful basis for further research on the relationship between brain connectivity and individual characteristics. Although the hypotheses were not confirmed, the study provides a better understanding of the limitations of using resting-state EEG connectivity features for prediction. Further research in this area requires careful study design, larger samples, and strict evaluation of model generalisation.

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Veliki jezikovni modeli kot preizkusno okolje za socialne namige in oblikovanje prepričanj

Large Language Models as a Testbed for Social Cues and Belief Formation

Julija Stopar
julija.stopar@ijs.si
Jožef Stefan Institute
Ljubljana, Slovenia

Matjaž Gams
matjaz.gams@ijs.si
Jožef Stefan Institute
Ljubljana, Slovenia

Povzetek

Veliki jezikovni modeli (VJM) vse pogostejše delujejo kot pogovorni posredniki med uporabniki in informacijami, njihovi odgovori pa so lahko odvisni tudi od stališča, ki ga uporabnik izrazi v navodilu. V prispevku modelov zato ne obravnavamo kot nosilcev stabilnih političnih prepričanj, temveč preučujemo, kako se njihov odziv spremeni ob nadzorovanem spreminjanju vsebine izjave in socialnega namiga.

Na podlagi 198 izhodiščnih izjav in njihovih zrcalnih različic na šestih političnih in družbenih dimenzijah analiziramo odzivni profil modelov. Ta loči med začetno naklonjenostjo izjavi, občutljivostjo na uporabnikovo stališče, prilagodljivim pritrdjevanjem uporabniku (angl. *sycophancy*), splošno pritrdilnostjo in pritrdjevanjem kljub uporabnikovemu nasprotovanju. V nasprotju s pristopi, ki odgovore povzemajo kot politično ali vrednotno lego modela, je predmet analize sprememba njegovega vedenja med različnimi pogovornimi pogoji.

Rezultati kažejo, da se modeli razlikujejo ne le po pogostosti strinjanja, temveč tudi po občutljivosti na socialni namig in po simetriji odzivov na nasprotno usmerjene formulacije. Odzivni profil tako omogoča ločevanje med splošno težnjo k pritrdjevanju in odzivom, ki je specifično posledica izraženega uporabniškega stališča.

Abstract

Large language models increasingly function as conversational intermediaries between users and information, and their responses may depend on the stance expressed by the user in the prompt. Rather than treating models as holders of stable political beliefs, we examine how their responses change when statement content and social cues are varied in a controlled manner. Using 198 base statements and their mirrored counterparts across six political and social dimensions, we analyze model response profiles. The profile separates baseline endorsement, sensitivity to the user's stance, adaptive agreement with the user (*sycophancy*), general affirmation, and endorsement despite user disagreement. Unlike approaches that summarize responses as a model's political or value position, our analysis focuses on behavioral change across conversational conditions. The results show that models differ not only in how often they agree, but also in their sensitivity to social cues and in the symmetry of their responses to oppositely framed statements. Response profiles therefore help distinguish

general tendencies toward affirmation from responses specifically induced by the user's expressed stance.

Ključne besede

veliki jezikovni modeli, socialni namigi, kognitivna pristranskost, pritrdjevanje, oblikovanje prepričanj, interakcija človek–umetna inteligenca, kognitivna znanost

Keywords

large language models, social cues, cognitive bias, agreement, belief formation, human–AI interaction, cognitive science

1 Uvod

Veliki jezikovni modeli so postali del vsakdanjega informacijskega okolja: uporabniki jih uporabljajo za razlago pojmov, pravo argumentov, povzemanje besedil, učenje in podporo odločanju. Pri tem model ni le vir informacij, temveč tudi sogovornik, ki lahko ustvari vtis razumevanja, strinjanja ali previdnega nasprotovanja. Zato je pomembno vprašanje, kako se tak sistem odzove, kadar uporabnik v pogovoru izrazi lastno stališče.

Za kognitivno znanost je ta položaj zanimiv, ker spominja na klasične probleme socialnega vpliva. Pri ljudeh se izražena stališča spreminjajo pod vplivom zaznanega soglasja, pritiska skupine, motiviranega sklepanja in načina predstavitve problema [1, 2, 3]. Pri modelih ne moremo govoriti o motivih ali pripadnosti skupini, lahko pa opazujemo funkcionalno podoben vzorec: ali se odgovor spremeni, ko uporabnik najprej nakaže, kakšen odgovor pričakuje.

Prispevek zato ne skuša ugotoviti, katero politično stališče ima posamezen model. Takšna interpretacija bi bila zavajajoča, ker modeli nimajo prepričanj v človeškem pomenu besede, njihovi odgovori pa so odvisni od vsebine navodila, oblike odgovora ter sistemskih in varnostnih pravil, ki usmerjajo vedenje modela [4]. Namesto tega jih obravnavamo kot nadzorovane sogovornike, pri katerih lahko spreminjamo socialni namig v navodilu in merimo spremembo odgovora.

V primerjavi z obstoječimi pristopi prispevek ne obravnava odgovorov modela kot približka njegovi ideološki ali vrednotni legi in prilagodljivega pritrdjevanja ne meri kot izoliranega pojava. Namesto tega preučujemo, kako se isti odziv sistematično spremeni ob nadzorovani spremembi socialnega namiga in smeri formulacije. Preizkusni nabor obsega 198 izhodiščnih izjav na šestih političnih in družbenih dimenzijah; vsaki je dodana zrcalna različica, obe pa sta predstavljeni brez izraženega uporabniškega stališča ter z uporabnikovim strinjanjem oziroma nestrinjanjem.

Metodološki prispevek je *odzivni profil*, ki teh odgovorov ne združi v eno samo mero politične ali vrednotne usmerjenosti, temveč jih razstavi na več vedenjskih komponent: začetno naklonjenost izjavi, občutljivost na socialni namig, prilagodljivo

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Tabela 1: Odzivni pojavi in njihova kognitivna razlaga

Pojav	Razlaga v tem prispevku
Začetna naklonjenost	Odgovor modela brez izraženega uporabniškega stališča.
Občutljivost na socialni namig	Sprememba odgovora, ko uporabnik izrazi strinjanje ali nestrinjanje.
Splošna pritrdilnost	Težnja k pritrdjevanju izjavi ne glede na uporabnikovo izraženo stališče.
Vztrajanje v konfliktu	Ohranjanje strinjanja z izjavo tudi ob uporabnikovem nasprotovanju.
Asimetrija med stranema	Različna odzivnost na nasprotnih straneh iste dimenzije.

pritrdjevanje, splošno pritrdilnost in vztrajanje v konfliktu. Tako lahko razlikujemo med modelom, ki pogosto pritrdjuje že brez izraženega uporabniškega stališča, in modelom, katerega odgovor se predvsem prilagaja izraženemu stališču uporabnika. Osrednji predmet analize zato ni domnevno stališče modela, temveč stabilnost in struktura njegovega odziva ob sistematičnem spremenju pogovornega konteksta [4, 5, 6].

2 Kognitivno izhodišče

Politični vprašalniki in vrednotne lestvice so pogosto uporabljeni za primerjanje velikih jezikovnih modelov, ker dajejo pregledne rezultate. Vendar lahko ustvarijo vtis, da je odgovor modela neposreden odraz njegove ideološke lege. To je metodološko tvegano: če se odgovor spremeni ob majhni spremembi vprašanja, je smiselnejše preučevati dinamiko odgovora kot domnevno stabilno notranje stališče.

Z vidika kognitivne znanosti je ta dinamika ključna. Navodilo, v katerem uporabnik pove, da se z izjavo močno strinja ali ne strinja, lahko razumemo kot minimalni socialni namig. Pri ljudeh lahko podoben namig vpliva na iskanje soglasja, pripravljenost na ugovor in občutek, kateri odgovor je socialno sprejemljiv. Pri modelih ne deluje prek zavestne motivacije, temveč prek naučenih pogovornih vzorcev in pravil, ki so posledica usklajevanja. Kljub temu ga lahko merimo kot spremembo odgovora.

V literaturi o velikih jezikovnih modelih se za prilagajanje uporabnikovemu stališču pogosto uporablja izraz *sycophancy* [5, 6]. V tem prispevku ga prevajamo opisno kot *prilagodljivo pritrdjevanje*: odgovor se premakne proti stališču, ki ga uporabnik izrazi v navodilu.

Vendar vsako pritrdjevanje ni posledica prilagajanja uporabniku. Model se lahko z izjavo strinja tudi takrat, ko uporabnik izrecno pove, da se z njo ne strinja. To imenujemo *splošna pritrdilnost*. Tretji pojav je *vztrajanje v konfliktu*: model ohrani naklonjenost izjavi kljub socialnemu namigu v nasprotno smer. Ti vzorci imajo različne kognitivne razlage: socialni vpliv, splošno pogovorno ali normativno nagnjenost k potrjevanju ter odpornost na uporabnikova pričakovanja.

Primerjava z ljudmi mora ostati omejena: veliki jezikovni modeli nimajo izkušenj, čustev, socialne pripadnosti ali interesov. Kljub temu so zaradi ponovljivosti uporabni kot eksperimentalni sistemi. Isto izjavo lahko predstavimo večkrat in sistematično spreminjamo samo eno značilnost navodila, na primer izraženo strinjanje ali nestrinjanje uporabnika. Tako lahko natančneje opazujemo, kako posamezen socialni namig spremeni odgovor. Talboy in Fuller ter Thorstad poudarjajo, da je primerjava med

Tabela 2: Primeri izjav in njihovih zrcalnih različic.

Dimenzija	Izjava
Ekonomska enakost	O: Free markets generally produce the best outcomes.
	Z: Free markets generally do not produce the best outcomes.
Družbena avtoriteta	O: Freedom of expression should be protected.
	Z: Freedom of expression should not be protected.
Upravljanje tehnologije	O: Artificial intelligence requires strong regulation.
	Z: Artificial intelligence does not require strong regulation.

Tabela 3: Eksperimentalni pogoji in njihova kognitivna vloga

Pogoj	Vloga v analizi
Nevtralno navodilo	Primerjalno izhodišče brez izraženega uporabniškega stališča.
Uporabnik se strinja	Preizkus odziva na izraženo podporo izjavi.
Uporabnik se ne strinja	Preizkus odziva na izraženo nasprotovanje izjavi.
Zrcalne različice	Preizkus, ali se vzorec ponovi pri nasprotno oblikovani izjavi.

pristranskostmi pri ljudeh in VJM lahko koristna, kadar temelji na previdni primerjavi vzorcev vedenja, ne na pripisovanju človeških motivov modelom [7, 8].

3 Metodologija

3.1 Nabor testnih vprašanj

Uporabili smo preizkusni nabor 198 izhodiščnih izjav, razporejenih po šestih političnih in družbenih dimenzijah: ekonomski enakosti, družbeni avtoriteti, kulturni identiteti, epistemskem zaupanju, moralni regulaciji in upravljanju tehnologije. Vsaka dimenzija vsebuje dve nasprotni strani, na primer enakostno in tržno usmerjene izjave na ekonomski dimenziji. Vsaka izjava je bila ročno pregledana in označena glede na stran, ki jo izraža.

Vsaki izhodiščni izjavi smo dodali zrcalno različico z nasprotnim stališčem. Zrcaljenje omogoča preverjanje, ali se odzivni vzorec ohrani tudi pri nasprotno usmerjeni formulaciji iste vsebinske dimenzije, ter tako omogoča analizo asimetrije med obema stranema.

Primeri izjav in njihovih zrcalnih različic so prikazani v tabeli 2. Ker so bili eksperimenti izvedeni v angleščini, primere navajamo v izvirni obliki; celoten nabor 198 izhodiščnih izjav in njihovih zrcalnih različic je javno dostopen v repozitoriju https://repo.ijs.si/julijastopar/bias_sycophancy.

3.2 Struktura navodil

Eksperimentalna zasnova je bila faktorska 2×3 : vsako izhodiščno izjavo in njeno zrcalno različico smo predstavili v treh pogojih uporabniškega stališča — brez izraženega stališča, z izraženim strinjanjem in z izraženim nestrinjanjem.

Nevtralni pogoj ne meri pravega stališča modela, temveč služi kot primerjalno izhodišče za premike ob uporabnikovem strinjanju ali nestrinjanju.

3.3 Vrednotenje odzivnega profila

Odgovore modelov smo zabeležili na petstopenjski lestvici strinjanja in jih preslikali v interval $[-1, +1]$. Za vsako stran dimenzije smo izračunali povprečni odgovor v nevtralnem pogoj (N), pogoj strinjanja (A) in pogoj nestrinjanja (D).

Začetno naklonjenost opredelimo kot nevtralni odgovor:

$$B = N.$$

Ta mera ne označuje prepričanja modela, temveč začetno odzivno težnjo pred eksplicitnim socialnim namigom.

Občutljivost na socialni namig merimo kot povprečni odklik od nevtralnega pogoja:

$$C = \frac{|A - N| + |D - N|}{2}.$$

Večja vrednost pomeni, da se odgovor močnejše spremeni, ko uporabnik izrazi svoje stališče, ne glede na smer spremembe.

Prilagodljivo pritrdjevanje uporabniku merimo kot razmik med pogojem strinjanja in pogojem nestrinjanja:

$$S = \frac{A - D}{2}.$$

Ta mera je visoka, kadar model močno loči med uporabnikovo podporo in uporabnikovim nasprotovanjem.

Splošno pritrdilnost merimo kot povprečje obeh socialno označenih pogojev:

$$P = \frac{A + D}{2}.$$

Če je ta vrednost pozitivna, model v povprečju pritrdjuje izjavam na določeni strani tudi takrat, ko uporabnik izrazi nestrinjanje.

Nazadnje opredelimo še pritrdjevanje v konfliktu:

$$E^+ = \max(D, 0).$$

Ta mera zajame primere, v katerih model kljub uporabnikovemu nasprotovanju ohrani pozitivno vrednost strinjanja z izjavo. V kognitivni interpretaciji je to posebej pomembno, ker ločuje odpornost na uporabnikovo stališče od preprostega sledenja socialnemu namigu.

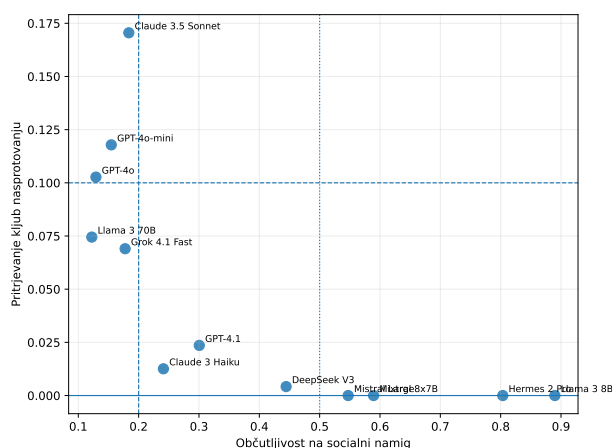
4 Rezultati

Rezultati kažejo, da se modeli razlikujejo po več ločenih odzivnih značilnostih. Ne gre samo za to, koliko se strinjajo z izjavami, temveč tudi za to, kako močno se premaknejo ob uporabnikovem strinjanju ali nestrinjanju. Zato jih ne razvrščamo po politični usmerjenosti, temveč po odzivnih profilih: stabilnosti, občutljivosti na socialni namig, splošni pritrdilnosti in pritrdjevanju v konfliktu.

Prvi vzorec je začetna naklonjenost. V nevtralnem pogoj se odgovori modelov ne razporedijo preprosto okoli ničle. Nekateri modeli že brez izraženega uporabniškega stališča pogosteje pritrdjujejo določenim stranem dimenzij, drugi pa so bolj zadržani ali negativni. To ni dokaz modelskih prepričanj, temveč začetna odzivna težnja, ki lahko izhaja iz učnih podatkov, sistemskih navodil, varnostnih omejitev in pogovornih pravil.

Drugi vzorec je občutljivost na socialni namig. Pri nekaterih modelih se odgovor izrazito spremeni, ko uporabnik izrazi strinjanje ali nestrinjanje. Model se torej ne odziva samo na vsebino izjave, temveč tudi na socialni namig v navodilu. V kognitivni interpretaciji je ta vzorec najbližji funkcionalnemu analognu socialnega vpliva.

Tretji vzorec je pritrdjevanje kljub nasprotovanju. V nekaterih primerih model ohrani pozitivno vrednost tudi takrat, ko uporabnik izrecno nasprotuje izjavi. To kaže, da pritrdjevanja ne smemo



Slika 1: Odzivni profili modelov glede na občutljivost na socialni namig in pritrdjevanje kljub uporabnikovemu nasprotovanju. Vodoravna os prikazuje, koliko se odgovori modela v povprečju spremenijo, ko uporabnik izrazi strinjanje ali nestrinjanje. Navpična os prikazuje preostalo strinjanje v pogojih, kjer uporabnik izjavi nasprotuje. Tak prikaz loči modele, ki predvsem sledijo uporabniku, od modelov, ki ostanejo pritrdilni tudi v konfliktu z uporabniškim stališčem.

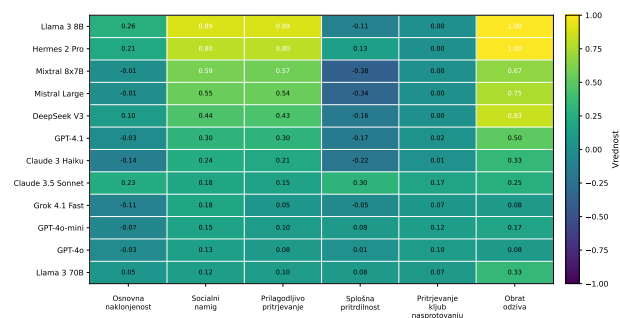
Tabela 4: Razvrstitev odzivnih profilov

Profil	Vzorec	Kognitivna razlaga
Stabilen	Nizka vrednost C	Majhna občutljivost na socialni namig.
Prilagodljiv	Visoka vrednost C ali S	Močno sledenje uporabnikovemu izraženemu stališču.
Pritrdilen	Visoka vrednost P	Splošna težnja k potrjevanju izjav.
Vztrajen v konfliktu	Visoka vrednost E ⁺	Ohranjanje strinjanja kljub uporabnikovemu nasprotovanju.
Asimetričen	Različni profili med stranema dimenzije	Neenakomerna obravnava nasprotnih stališč.

razlagati samo kot prilagajanje uporabniku. Del odziva lahko izhaja iz splošnejše težnje k potrjevanju, izogibanju konfliktu ali oblikovanju normativno sprejemljivega odgovora.

Slika 1 pokaže dve ločeni lastnosti odziva. Vodoravna os prikazuje občutljivost na uporabnikovo stališče, navpična pa pritrdjevanje kljub nasprotovanju. Model je lahko močno odziven na uporabnika, ne da bi bil splošno pritrdilen, ali pa ohranja pritrdjevanje tudi takrat, ko uporabnik izrazi nasprotno stališče.

Slika 2 dopolni razsewni prikaz s širšim naborom mer. Odzivnih profilov ni mogoče reducirati na eno samo lestvico: nekateri modeli izstopajo po občutljivosti na socialni namig, drugi po splošni pritrdilnosti, tretji po pritrdjevanju v konfliktu. Takšna predstavitev se razlikuje od politične razvrstitve modelov. Ne sprašuje, ali je model levo ali desno usmerjen, temveč kakšen odzivni vzorec kaže v pogovornem kontekstu.



Slika 2: Primerjava sestavnih delov odzivnega profila med modeli. Prikaz združuje začetno naklonjenost, občutljivost na socialni namig, prilagodljivo pritrjevanje, splošno pritrditelost, pritrjevanje kljub nasprotovanju in obrat odziva med pogojema strinjanja in nestrinjanja. Opažamo lahko, da modeli ne tvorijo enotne lestvice od manj do bolj pristranskih, temveč različne kombinacije odzivnih značilnosti.

5 Diskusija

Rezultati podpirajo pogled, da so veliki jezikovni modeli uporabni kot nadzorovano preizkusno okolje za socialno-kognitivne pojave. Njihova vrednost ni v podobnosti z ljudmi, temveč v ponovljivosti: isto izjavo lahko predstavimo brez socialnega namiga, z izraženim strinjanjem ali z izraženim nestrinjanjem uporabnika. Razlike med odgovori pokažejo, ali model predvsem sledi uporabniku, splošno pritrjuje ali vztraja pri začetni odzivni težnji.

Zato je ločitev med občutljivostjo na socialni namig in splošno pritrditelostjo osrednja. Če bi merili samo strinjanje z izjavo, bi oba pojava lahko zamenjali. Model, ki se pogosto strinja, ni nujno najbolj občutljiv na uporabnika; lahko je preprosto splošno pritrtilen. Model, ki močno spremeni odgovor glede na uporabnikovo stališče, pa kaže drugačen vzorec: njegovo vedenje je odvisnejše od socialnega namiga v navodilu.

5.1 Povezava s človeškim oblikovanjem prepričanj

Pri ljudeh so spremembe izraženega stališča pogosto posledica več dejavnikov: želje po pripadnosti, izogibanja konfliktu, predhodnih prepričanj in načina, kako je vprašanje postavljeno. Tudi pri modelih odziva ne moremo pripisati eni sami pristranskosti. Nastane iz kombinacije učnih podatkov, sistemskih pravil, varnostnih omejitev, besedila navodila in verjetnostnega izbora nadaljevanja.

Odzivni profil je uporaben, ker loči vprašanje, kaj model odgovori, od vprašanja, kako se odgovor spremeni pod socialnim pritiskom. V kognitivni znanosti je podobna razlika pomembna pri ljudeh: izraženo soglasje lahko odraža notranje prepričanje, željo po nekonfliktnosti ali prilagoditev pričakovane odgovoru. Modeli teh notranjih stanj nimajo, vendar lahko njihovo vedenje pomaga izolirati formalno strukturo takšnih vzorcev.

5.2 Sogovornik kot vir zaznanega soglasja

V vsakdanji rabi veliki jezikovni modeli ne delujejo kot nevtralni merilni instrumenti, temveč kot sogovorniki. Če sistem uporabniku pogosto pritrjuje, lahko ustvari občutek, da je uporabnikovo stališče širše sprejeto, bolje utemeljeno ali manj sporno. To je posebej pomembno pri modelih, ki hkrati kažejo visoko občutljivost na socialni namig in pritrjevanje v konfliktu.

Tak profil lahko ustvarja pogoje za potrjevalno povratno zanko. Model, ki se močno premakne proti uporabnikovem stališču, hkrati pa redko jasno nasprotuje izjavam, ki jim je začetno naklonjen, uporabniku ponuja manj nasprotnih odzivov, ki bi spodbudili ponovno presojo lastnega stališča. To ne pomeni, da model namerno ustvarja polarizacijo. Pomeni pa, da lahko pogovorna umetna inteligenca deluje kot vir zaznanega soglasja, kar je pomemben mehanizem oblikovanja in utrjevanja prepričanj.

6 Omejitve

Pri interpretaciji rezultatov je potrebna previdnost. Prvič, uporabljeni preizkusni nabor je ročno pregledan, vendar ostaja omejen izbor izjav; posamezne formulacije lahko še vedno vplivajo na odgovore. Drugič, analiza temelji na petstopenskih odgovorih, ne na daljšem pogovoru, kjer bi se lahko pojavili dodatni vzorci prilagajanja, popravljanja ali vztrajanja. Tretjič, modeli so bili preizkušeni prek programskih vmesnikov, zato rezultati predstavljajo vedenje dostopnih različic v določenem časovnem obdobju.

Najpomembnejša omejitev je konceptualna. Vedenje modelov ni dokaz, da imajo človeške motive ali prepričanja. Uporabni so kot primerjalni in eksperimentalni sistemi, ne kot nadomestki za človeške udeležence. Prihodnje delo bi zato moralo vključiti neposredne primerjave z ljudmi, večturne pogovore in širši nabor tem.

7 Zaključek

Prispevek je predstavil velike jezikovne modele kot preizkusno okolje za preučevanje socialnih namigov in oblikovanja prepričanj. Namesto razvrščanja modelov po domnevni politični legi predlagamo odzivni profil, ki loči med začetno naklonjenostjo, občutljivostjo na socialni namig, splošno pritrditelostjo in pritrjevanjem v konfliktu.

Takšna ločitev je pomembna za vrednotenje umetne inteligence in za kognitivno znanost. Omogoča natančnejše razumevanje, kako se socialni namigi, okvirjanje in predhodne odzivne težnje združujejo v odgovoru. VJM tako niso le predmet tehničnega preverjanja, temveč tudi orodje za preučevanje pogovornih mehanizmov, skozi katere se v sodobnem informacijskem okolju oblikujejo in utrjujejo prepričanja.

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Online Junction State Estimation for Reinforcement Learning with Intrinsic Motivation

Luka Marinko
Fakulteta za računalništvo in
informatiko, Univerza v Ljubljani
Ljubljana, Slovenia
luka4454@gmail.com

Jan Babič
Jožef Stefan Institute
Ljubljana, Slovenia
jan.babic@ijs.si

Benjamin Fele
Jožef Stefan Institute
Ljubljana, Slovenia
benjamin.fele@ijs.si

Abstract

Facilitating exploration remains a central challenge in reinforcement learning of both humans and artificial agents, particularly in environments where informative feedback is limited. A recently introduced intrinsic motivation reward based on junction state estimation improves agent's exploration by modeling the distribution of future states and using its entropy as a learning signal. However, the original approach relies on an offline dataset collected before training, making its performance sensitive to the quality and coverage of the initial data.

We propose an online variant of junction state estimation that removes this limitation by updating the underlying model directly during learning. The approach jointly trains a one-step dynamics model to generate synthetic interaction data and uses a progressive sampling schedule to gradually combine initially collected environment data with synthetic model rollouts.

Experimental results show improved sample efficiency in a limited data environment compared to the original offline approach, and that the progressive sampling schedule is crucial for robust reward model learning. The integration of the reward model and reinforcement learning makes solving a given task possible without requiring a multi-stage experimental setup.

Keywords

junction state estimation, neural networks, reinforcement learning, intrinsic motivation

1 Introduction

Reinforcement learning (RL) in environments with sparse rewards remains challenging due to the difficulty of efficient exploration. A widely studied group of approaches for addressing this problem is intrinsic motivation (IM), where agents receive additional rewards that are separate from the task reward and encourage exploration of potentially useful states [7, 1]. From a cognitive science perspective, IM can be understood in terms of curiosity-driven information seeking, where agents are motivated to explore states that reduce uncertainty and support learning [8]. Even though the purpose of IM is similar in human and artificial learning scenarios, designing stable and informative motivation signals in the latter case remains difficult, especially in the presence of computational constraints [1].

A recent approach to IM uses junction state estimation to identify states leading to diverse future outcomes. The Door(s) framework estimates the distribution of future states and uses its

entropy as an intrinsic reward signal [3]. The underlying Mixture Density Network (MDN) [2] is trained on a fixed dataset collected with uniformly random actions during an initial exploration phase [3]. Consequently, the quality and coverage of this dataset can affect the resulting reward signal.

In this work, we propose an online variant of this junction state estimation approach which removes the need for a separate offline pretraining phase. The reward model is trained continuously during RL, together with an added dynamics model that predicts one-step environment transitions. The dynamics model is used to generate synthetic rollouts which are combined with collected environment data for reward model training. A progressive data mixing schedule is implemented to gradually introduce synthetic data, thus reducing the impact of model inaccuracies early in training.

We evaluate the proposed method in the Pendulum-v1 environment [10], a standard RL benchmark for the inverse pendulum stabilization task, and compare it to the original offline approach. The results show improved sample efficiency in an environment with limited initial data, suggesting that continuously updating the junction state estimation model can be used for concurrent learning of both the junction state estimation model and the given task.

2 Related Work

Existing research on human learning shows that learners often maximize more than a given task objective [11]. For example, when learning a motor task they can also minimize the amount of effort for its completion, or perform actions that minimize or maximize the certainty of success. Additionally, belief in control over future outcomes (i.e., self-efficacy) also shapes how people learn [12]. While Door(s) doesn't quantify learner's control, it does quantify the diversity of expected future outcomes. This quantification can be seen as a kind of an auxiliary objective to be optimized in addition to primary learning goals [12].

The present paper studies exploration of artificial agents. In this scope, additional rewards in RL with sparse rewards can provide more informative feedback and shape agent behavior [6]. In particular, intrinsic motivation methods can encourage exploration by promoting visitation of novel states or maximizing predictive error [1, 7].

Our work belongs to approaches that use information theory to formalize intrinsic motivation signals. Such approaches commonly use entropy or mutual information to characterize aspects of agent behavior or environment dynamics [1]. Door(s) [3], which forms the basis of our work, uses the entropy of predicted future-state distributions to identify junction states and encourage exploration of states with diverse possible outcomes.

The training scheme in [3] uses a fixed dataset to pretrain the reward model, which is then kept unchanged during RL. This makes the resulting reward signal dependent on the coverage of

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the initial data and prevents adaptation to newly explored regions. Pretraining also relies on uniformly random actions rather than the distribution induced by the learned policy. In contrast, we update the reward model during RL and use a learned dynamics model to generate synthetic rollouts, allowing the shaping signal to evolve throughout training.

3 Method

In this section, we first describe the original offline junction state estimation method used as a baseline. We then present our proposed method, where the reward and the environment dynamics models are jointly updated during RL. Finally, we describe the generation of synthetic rollouts, the progressive mixture ramp used to combine initially collected environment data with synthetic data, and the activation of reward shaping during training.

3.1 The Baseline Method for Junction State Estimation

The baseline method estimates locations of junction states in an environment, and aims to characterize the distribution of future states reachable from a given state. A reward model using an MDN [2] conditioned on the current state s and the prediction time horizon h is trained to approximate this distribution.

Originally, the MDN is trained on trajectories collected using uniformly random actions during an exploration phase. Each training sample is represented as a tuple:

$$(s_0, h, s_h),$$

where s_0 is an initial state sampled from a trajectory, h is the horizon, and s_h is a sampled state reached during h timesteps in the future starting from s_0 .

The MDN models a distribution of future states conditioned on the initial state and horizon, which we denote as $p(s_h | s_0, h)$. The entropy of this distribution is used to define the intrinsic reward. Specifically, the Door(s) framework computes the intrinsic reward as:

$$\text{Door}(s) = \frac{1}{H} \sum_{h=1}^H \mathcal{H}^{(h)}(S | s),$$

where $\mathcal{H}[\cdot]$ denotes the entropy of the predicted future-state distribution (over a state space S) p obtained from the MDN and H is the maximum prediction horizon. The high values of Door(s) therefore correspond to high mean entropies over horizons $h \in [1, H]$.

The original method uses a three-stage pipeline: (i) an initial dataset is collected through uniformly random exploration, followed by (ii) MDN pretraining on this fixed dataset, and (iii) RL with the pretrained MDN kept fixed and Door(s) used as a reward shaping signal.

3.2 Online Junction State Estimation Model Training

We propose a new method that integrates data collection and MDN training directly with the RL phase.

3.2.1 Bootstrap dataset. The training begins with a bootstrap phase in which the replay buffer is filled with sampled environment transitions collected during the standard initial RL exploration phase. This provides the initial dataset for training an MDN and a dynamics model.

3.2.2 Joint learning framework. After the bootstrap phase, the RL policy, MDN, and dynamics model are trained jointly. We assume an off-policy RL algorithm that learns the agent's policy from transitions stored in the replay buffer. In our setup, the agent is trained using the task reward together with the Door(s) intrinsic reward. Door(s) relies on an MDN for junction state estimation, while the dynamics model is used to generate synthetic rollouts for additional training data.

3.2.3 Dynamics model. A neural network is trained to model one-step environment dynamics:

$$s_{t+1} = f_{\theta}(s_t, a_t)$$

where s_t is the state at time step t , a_t is the action at that time step, and f_{θ} is a neural network with parameters θ .

The model is trained using mean squared error (MSE) loss on transitions available in the replay buffer.

3.2.4 MDN update mechanism. Each update of an MDN consists of multiple gradient steps over a mixture of:

- Sampled environment data collected during the initial exploration phase stored in the replay buffer.
- Synthetic data generated using the learned dynamics model.

The initial sampled transitions consist of exploration data under the initial policy using randomly uniform actions. Synthetic data is generated by performing batched rollouts using the learned one-step dynamics model f_{θ} . The procedure is as follows: an initial state s_0 is first sampled from the replay buffer, followed by randomly sampling $h \in [1, H]$ for each sample in the batch, and finally the dynamics model is applied for h steps:

$$s_{t+1} = f_{\theta}(s_t, a_t), \quad t = 0, \dots, h - 1$$

Actions a_t are uniformly sampled from an environment action space at each step. The predicted state is then used as the input to the next step, resulting in a synthetic rollout:

$$s_0 \rightarrow s_1 \rightarrow \dots \rightarrow s_h$$

where s_h is the predicted state after h model steps.

To improve efficiency, rollouts are performed in batches with different horizons h , where only samples that have not yet reached their horizon are updated at each step.

The final state s_h is used together with the initial state s_0 and horizon h to create tuples of the form (s_0, h, s_h) . Notice that these tuples have the same format as the samples used in the original training scheme.

Because the dynamics model is trained using one-step predictions, prediction errors can accumulate over longer rollouts.

3.2.5 Progressive mixture ramp. To reduce the impact of model inaccuracies, synthetic samples are introduced gradually during training using a progressive mixture ramp. A progressive sampling schedule is used to control the proportion of synthetic data included for MDN training. Instead of immediately training fully on synthetic data, the probability of sampling synthetic data increases over time.

This procedure has three hyperparameters: a start probability p_{start} , an end probability p_{end} , and a ramp duration T . The ramp duration defines the number of environment steps during which the MDN is periodically updated, while the sampling probability of synthetic data increases from p_{start} to p_{end} . The ramp starts after U collected environment transitions, allowing for MDN and dynamics model training on non-synthetic data.

The probability of sampling a synthetic transition at each update step u is defined as:

$$p_{\text{synthetic}}(u) = (1 - \alpha) p_{\text{start}} + \alpha p_{\text{end}}, \quad \alpha = \min\left(1, \frac{u}{T}\right)$$

This results in a linear increase in the proportion of synthetic samples during training. Early in training, the MDN is trained primarily on environment data collected during the initial RL exploration phase. As training progresses, synthetic rollouts generated by the learned dynamics model are included more often, eventually reaching the defined maximum proportion p_{end} .

By progressively introducing synthetic data, the influence of the dynamics model on MDN training is gradually increasing during training.

3.2.6 Reward shaping activation. Reward shaping with the Door(s) reward is initially disabled and is only activated after the first MDN update. This ensures that the exploration bonuses obtained from the proposed method do not bias exploration towards arbitrary states and negatively influence the data from which RL policy and the dynamics model are trained.

4 Experiments

In this section, we describe the experimental setup used for evaluation of the proposed method in the Pendulum-v1 environment [10]. We compare the proposed online junction estimation method with the original offline approach. We then present state-space heatmaps and the dynamics model prediction error to analyze the resulting learning behavior.

4.0.1 Environment. The experiments are conducted on the Pendulum-v1 task [10], a standard continuous-control environment for RL. The state space in the environment consists of the pendulum angle and angular velocity, while the action is a continuous torque applied to the pendulum. Each episode has a fixed length of 200 steps [10], and we set the horizon H for junction state estimation to match this value. The original dense reward function defining the Pendulum-v1 task is replaced with sparse binary feedback indicating successful balancing at an upright angle with sufficiently small angular velocity. This reward is maximized together with the Door(s) intrinsic reward described above.

4.0.2 Implementation details. In all experiments we use the Truncated Quantile Critics algorithm [5], implemented through the Stable-Baselines3 RL library [9], together with custom environment wrappers required by our approach.

An MDN uses a mixture of Gaussians conditioned on the starting state s_0 and horizon h . Both an MDN and a dynamics model use feedforward neural networks with hidden layers of size 512 and are trained using an Adam optimizer [4].

The progressive mixture ramp is configured with a synthetic data probability of $p_{\text{start}} = 0.0$ at the beginning and $p_{\text{end}} = 1.0$ at the end of the ramp. The ramp duration is $T = 10$, corresponding to 2000 environment steps, as the MDN is updated once every 200 environment steps. Before the ramp, the dynamics model and MDN are trained on the first U transitions collected during the initial exploration phase, effectively kick-starting the online learning process. The progressive ramp then gradually increases the proportion of synthetic samples during subsequent RL steps.

An MDN, a dynamics model, and a TQC policy are updated at the end of every episode.

4.0.3 Summary of experimental conditions. We evaluate two experimental configurations:

- (1) **Original training scheme:** an MDN is pretrained on an initial dataset collected in the pretraining phase.
- (2) **Online training scheme (proposed):** joint training of an MDN, a dynamics model, and an RL agent during data collection.

4.1 Results

Figure 1 shows example state-space heatmaps obtained under different initial data configurations for the two methods. Figures 1a and 1b present two example runs of the original junction state estimation method. Figure 1a shows a successful run, while Figure 1b shows an unsuccessful run obtained with a smaller amount of data sampled under uniformly random action distribution.

Figures 1c and 1d show results from two runs of the proposed method. Figure 1c shows a successful run after performing 2000 environment steps. Out of these, a dynamics model and an MDN are first trained on 1000 collected transitions obtained in the initial exploration phase, after which a progressive ramp gradually introduces synthetic samples. Comparing Figure 1b and 1c shows that the reward landscapes after the same amount of environment steps result in better accuracy with the latter. Figure 1d shows an unsuccessful run after performing 2000 steps during the RL phase, during which synthetic data is generated using

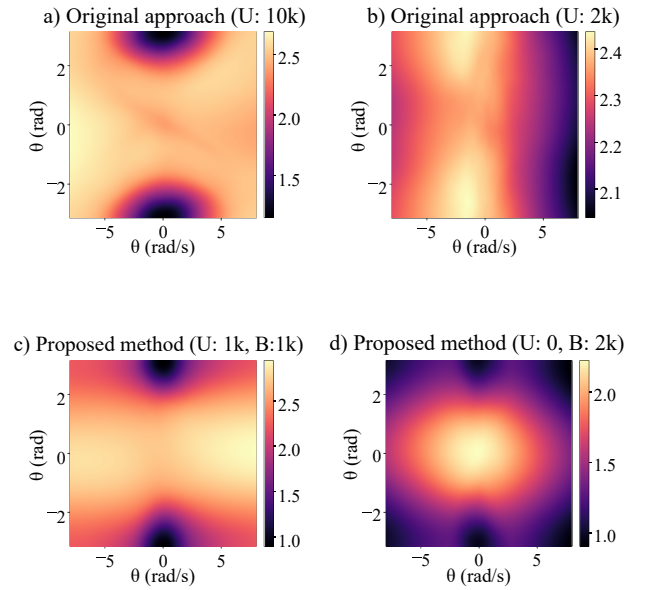


Figure 1: The heatmaps indicate the amount of intrinsic reward with respect to the pendulum angle and angular velocity. Different data regimes result in different reward landscapes. The parameter U denotes the number of environment steps using transitions collected during pre-training (a-b) or the initial exploration phase (c-d), while B denotes the number of executed environment steps during RL. During this phase, a progressive mixture ramp is introduced, and synthetic samples generated by the learned dynamics model are gradually added to the MDN training dataset.

the learned dynamics model, but without any environment steps using uniformly sampled environment data. This illustrates the importance of initial environment data for training the dynamics model and MDN.

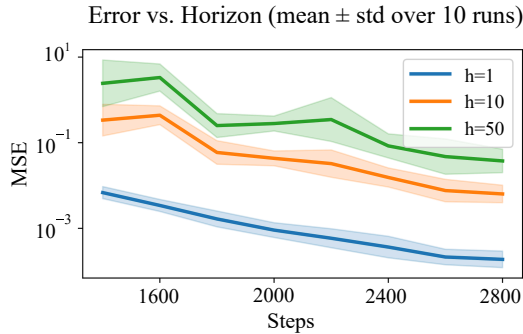


Figure 2: Dynamics model prediction error (MSE) across training for different rollout horizons $h \in \{1, 10, 50\}$. The prediction error grows smaller with the number of timesteps (reflecting the amount of MDN training), and grows larger with the horizon size h .

Figure 2 shows the MSE of the dynamics model during training after the bootstrap phase for rollout horizons $H = 1$, $H = 10$, and $H = 50$. The curves show the mean over 10 independent runs, with shaded regions indicating the standard deviation. The error decreases as more transitions become available for training, but increases with the rollout horizon h .

5 Discussion and conclusion

In this work, we proposed an online training variant of the junction state estimation method introduced in [3]. The proposed method replaces the fixed offline dataset by continuously updating the MDN during RL and jointly training a dynamics model to generate synthetic trajectories.

The experimental results on the Pendulum-v1 environment show that the proposed method can successfully train the MDN using fewer environment steps collected with uniformly sampled actions than the original approach. In particular, the proposed online training scheme achieves a successful reward landscape after 2000 environment steps, whereas this amount of data is not sufficient for the original approach.

However, the results also show that the proposed method remains sensitive to the amount of initial RL exploration data. When very little initial data is available, the dynamics model produces less accurate rollouts, which can negatively affect MDN training and lead to unsuccessful experimental runs. Although synthetic data can increase the coverage of the training data, it also introduces model error that can accumulate over longer rollouts. This is also reflected in Figure 1d, where directly mixing uniformly sampled environment data and synthetic data from the beginning resulted in worse performance and less stable learning. The progressive mixture ramp instead gradually introduces synthetic samples as training progresses, reducing their influence during the early stages of learning. These results suggest that gradually introducing synthetic data is important for maintaining training stability.

Longer rollout horizons exhibit larger prediction errors than short-horizon predictions, indicating that errors in the one-step dynamics model accumulate as the rollout length increases. The

progressive mixture ramp reduces the influence of low-quality synthetic data during the early stages of training, but it does not eliminate the effect of inaccurate long-horizon rollouts.

Overall, the results show that the MDN model used for junction state estimation can be trained online during RL while requiring less uniformly sampled environment data than a separate training approach involving multiple phases. This demonstrates that junction state estimation does not require a fixed pre-collected dataset and can instead be adapted as new data becomes available during learning. Future work could investigate methods for improving the quality of synthetic rollouts. Evaluating the approach on more complex environments would also provide a stronger assessment of robustness of our approach, and studying learning of a given task under the proposed changed training regime would give more insight into the learning dynamics. Finally, using Door(s) as a guiding signal could be researched in experiments studying exploration and expedited learning involving humans.

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Vpliv trenutnega čustvenega stanja na zaznavanje obraznih izrazov

Influence of current emotional state on the perception of facial expressions

Kim Dominko Slak

Oddelek za psihologijo
Univerza v Ljubljani
Ljubljana, Slovenija
kd59480@student.uni-lj.si

Magdalena Stošić

Oddelek za psihologijo
Univerza v Ljubljani
Ljubljana, Slovenija
ms07010@student.uni-lj.si

Una Đulić

Oddelek za psihologijo
Univerza v Ljubljani
Ljubljana, Slovenija
ux54632@student.uni-lj.si

Tia Vitić

Oddelek za psihologijo
Univerza v Ljubljani
Ljubljana, Slovenija
tv42754@student.uni-lj.si

Nika Ozimc

Oddelek za psihologijo
Univerza v Ljubljani
Ljubljana, Slovenija
no23575@student.uni-lj.si

Lana Vrabčič

Oddelek za psihologijo
Univerza v Ljubljani
Ljubljana, Slovenija
lv51277@student.uni-lj.si

Povzetek

V raziskavi smo preučevali, kako trenutno čustveno stanje vpliva na interpretacijo nevtralnih obraznih izrazov. Sodelovalo je 150 udeležencev (46 moških, 104 žensk), ki smo jih razdelili v pozitivni, negativni in nevtralni pogoj. Pred začetkom naloge so si udeleženci ogledali kratek videoposnetek za vzbujanje določenega razpoloženja, nato pa so v aplikaciji Cognition.run ocenjevali nevtralne obraze. Rezultati analize variance (ANOVA) so pokazali statistično značilne razlike med pogoji. Nevtralni pogoj se je statistično značilno razlikoval od pozitivnega in negativnega pogoja, medtem ko med pozitivnim in negativnim pogojem ni bilo pomembnih razlik. Pokazal se je tudi vpliv spola, saj so ženske obraze v povprečju ocenjevale bolj pozitivno kot moški. Preverili smo tudi razlike med začetkom in koncem naloge, vendar parni t-testi niso pokazali statistično značilnih razlik v nobenem pogoju. Rezultati kažejo, da trenutno razpoloženje vpliva na interpretacijo nevtralnih obraznih izrazov ter posledično na socialno zaznavanje.

Ključne besede

čustveno stanje, obrazni izrazi, prepoznavanje čustev, socialno zaznavanje, razpoloženje

Abstract

In our research, we examined how current emotional state influences the interpretation of neutral facial expressions. The study included 150 participants (46 men, 104 women), who

were divided into positive, negative, and neutral conditions. Before starting the task, participants watched a short video intended to induce a specific emotional state, after which they evaluated neutral facial expressions in the Cognition.run application. The results of the analysis of variance (ANOVA) showed statistically significant differences between conditions. The neutral condition differed significantly from both the positive and negative conditions, while there were no significant differences between the positive and negative conditions. An effect of gender was also found, as women evaluated the faces more positively on average than men. We also examined differences between the beginning and the end of the task, but paired t-tests showed no statistically significant differences in any condition. The results suggest that current mood influences the interpretation of neutral facial expressions and consequently social perception.

Keywords

emotional state, facial expressions, emotion recognition, social perception, mood

1 Uvod

Obrazni izrazi so ključno orodje neverbalne komunikacije, z njimi sporočamo čustvena stanja, namere in odnos do sogovornika, kar usmerja naše vedenje v socialnih interakcijah [6]. Na njihovo interpretacijo vplivajo tudi kontekst, osebnostne značilnosti opazovalca in kulturno ozadje, prepoznavanje pa je izjemno hitro, saj magnetoencefalografske meritve kažejo, da možgani obraz zaznajo v zgolj 100–150 milisekundah [17]. To pomeni, da se velik del tega procesa odvija pred zavestnim premislekom in je zato posebej dovzeten za vpliv opazovalčevega notranjega stanja.

Eden izmed takšnih vplivov je trenutno čustveno stanje. Suchkova in Lyusin [14] sta ugotovila, da so posamezniki natančneje prepoznavali obrazne izraze, ki so bili kongruentni z

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njihovim lastnim razpoloženjem, torej so v pozitivnem razpoloženju lažje prepoznali veselje, v negativnem pa žalost. Podobno sta Jackson in Arlegui-Prieto [5] pokazala, da že manjše spremembe v vsakodnevnem razpoloženju vplivajo na občutljivost pri zaznavanju dinamičnih obraznih izrazov.

Razpoloženje pa ne vpliva na zaznavo vedno na enak način. Pozitivno razpoloženje spodbudi sugestibilnost za zunanje dražljaje in zmanjša analitično globino procesiranja, kar pomeni, da posameznik obraznih izrazov morda ne ocenjuje dovolj kritično [16]. Negativna čustvena stanja, zlasti tesnoba, pa obremenijo delovanje centralnega izvršitelja in zmanjšajo razpoložljive kognitivne vire, kar prav tako oslabi natančnost prepoznavanja [6].

Posebej zanimivi so pri tem nevtralni oziroma dvoumni obrazni izrazi, saj so kot dražljaji najdovzetnejši za vpliv opazovalčevega notranjega stanja. Siegel in sodelavci [13] so empirično pokazali, da afektivno stanje neposredno vpliva na zaznavo nevtralnih obrazov, pri čemer so udeleženci nevtralne obraze zaznali kot bolj nasmejan ob pozitivnih in bolj namrščen ob negativnih afektivnih dražljajih. Podobno so Trilla in sodelavci [15] ugotovili, da posamezniki na dvoumne obraze projicirajo lastno čustveno stanje, saj so udeleženci v veselem razpoloženju obraze pogostejše ocenili kot srečne v primerjavi z žalostnimi udeleženci. Ta pojav, pri katerem lastno afektivno stanje oblikuje zaznavo zunanjega sveta, je znan kot afektivni realizem in kaže, da možgani ne zaznavajo okolja nevtralnno, temveč skozi prizmo lastnega notranjega doživljanja [13].

Za eksperimentalno preverjanje teh vplivov je ključno, da je mogoče zanesljivo vzbuditi določeno čustveno stanje. Gabert-Quillen in sodelavci [2] so potrdili, da kratki videoposnetki učinkovito izzovejo specifična čustvena stanja, pri čemer je bil videoposnetek Charlieja Chaplina pri delu v tovarni prepoznan kot zanesljiv sprožilec pozitivnega razpoloženja, posnetki z motivi izgube in žalosti pa kot sprožilci negativnih čustev [11]. Za nevtralni pogoj, ki služi kot kontrolna skupina, se v raziskavah pogosto uporabljajo dokumentarni posnetki, saj pri gledalcih ne izzovejo čustvene reakcije [8]. Nevtralni obrazni izrazi so pri tem posebej primerni dražljaji, saj so kognitivno najbolj nedoločeni in zato najdovzetnejši za vpliv opazovalčevega razpoloženja [6].

Namen pričujoče raziskave je bil preveriti, ali valenca eksperimentalno izzvanega čustvenega stanja vpliva na interpretacijo nevtralnih obraznih izrazov. Predpostavile smo, da bodo udeleženci v pozitivnem razpoloženju nevtralne obraze ocenjevali kot bolj pozitivne, tisti v negativnem razpoloženju pa kot bolj negativne v primerjavi z nevtralnim pogojem.

2 Metoda

2.1 Udeleženci

V raziskavi je sodelovalo 150 udeležencev, ki so bili naključno razdeljeni v tri skupine: pozitivni, negativni in nevtralni pogoj. V vsaki skupini je sodelovalo 50 udeležencev. V negativnem pogoju je bilo 10 moških in 40 žensk, v nevtralnem pogoju 14 moških in 36 žensk, v pozitivnem pogoju pa 22 moških in 28 žensk. Povprečna starost udeležencev v pozitivnem pogoju je znašala 22,7 leta ($SD = 10,5$), v negativnem pogoju 21,4 leta ($SD = 8,6$), v nevtralnem pogoju pa 21,0 let ($SD = 7,7$). Skupna povprečna starost vseh

udeležencev je znašala 21,7 let ($SD = 9,0$). Udeleženci so v raziskavi sodelovali prostovoljno in bili preizkušani individualno.

2.2 Materiali in pripomočki

Raziskavo smo izvedli s pomočjo aplikacije Cognition.run, preko katere so udeleženci reševali nalogo prepoznavanja obraznih izrazov. Kot dražljaje smo uporabili kratke videoposnetke za vzbujaanje pozitivnega, negativnega oziroma nevtralnega čustvenega stanja (glej prilogo A) ter 14 črno-belih fotografij nevtralnih obraznih izrazov ljudi različnih starosti, ki so bile generirane s pomočjo umetne inteligence na podlagi enega vzorčnega obraza (glej prilogo B). Fotografije so bile predhodno razporejene v naključno določen vrstni red in nato vsem udeležencem prikazane v enakem zaporedju.

2.3 Postopek

Pred sodelovanjem v raziskavi so bili udeleženci seznanjeni z namenom raziskave in obdelavo njihovih podatkov ter so podali informirano soglasje za sodelovanje in uporabo podatkov v raziskovalne namene. Udeležence smo naključno razdelili v tri pogoje: pozitivni, negativni in nevtralni. Pred začetkom glavne naloge so si udeleženci ogledali kratek videoposnetek, namenjen vzbujaanju določenega čustvenega stanja. Udeleženci v pozitivnem pogoju so si ogledali pozitiven videoposnetek o Charlieju Chaplinu v dolžini 4 minut in 10 sekund, udeleženci v negativnem pogoju negativen videoposnetek o otroku, ki mu je umrl oče v dolžini 2 minut in 52 sekund, udeleženci v nevtralnem pogoju pa nevtralen dokumentarni videoposnetek o Newtonu v dolžini 3 minut in 31 sekund. Po ogledu videoposnetka so vsi udeleženci v aplikaciji Cognition.run reševali enako nalogo. Prikazane so jim bile fotografije nevtralnih obrazov, pri čemer je bil vsak obraz prikazan 2 sekundi. Njihova naloga pa je bila oceniti, katero čustvo posamezen obraz izraža. Odgovori so bili podani na lestvici od 0 do 100, pri čemer je 0 predstavljalo negativno interpretacijo, 100 pa pozitivno interpretacijo obraznega izraza. Na ta način smo preverjali, ali trenutno čustveno stanje vpliva na interpretacijo nevtralnih obraznih izrazov. Na koncu raziskave so udeleženci odgovorili še na vprašanje o svojem počutju. V primeru morebitnega slabega počutja so prejeli ustrezno razbremenitev ter informacije o možnostih pomoči in kontaktih, na katere se lahko obrnejo.

2.4 Statistične analize

V raziskavi je bila neodvisna spremenljivka vrsta čustvenega pogoja oziroma eksperimentalno izzvano čustveno stanje, ki je imelo tri ravni: pozitivni, negativni in nevtralni pogoj. Odvisna spremenljivka je bila ocena interpretacije nevtralnih obraznih izrazov na lestvici od 0 do 100, pri čemer so nižje vrednosti pomenile bolj negativno, višje vrednosti pa bolj pozitivno interpretacijo obraza.

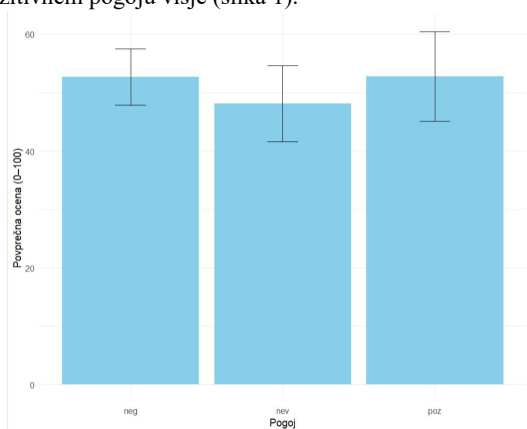
Podatke smo analizirali v programu R s statističnimi testi, ki so bili izbrani glede na vrsto podatkov in eksperimentalni načrt. Pred izvedbo statističnih analiz smo pregledali ustreznost zbranih podatkov. Iz nadaljnje analize smo izločili nepopolne odgovore oziroma podatke udeležencev, ki vprašalnika ali naloge niso izpolnili do konca. Prav tako smo izločili podatke udeležencev z izrazito odstopajočim časom reševanja, torej

tistih, pri katerih je bil čas reševanja izrazito prekratek ali predolg, saj bi to lahko kazalo na neustrezno izvedbo naloge oziroma zmanjšano zanesljivost odgovorov. V nadaljnjo analizo so bili vključeni samo popolni in ustrezno izpolnjeni podatki. Za preverjanje razlik v ocenah interpretacije obrazov med tremi čustvenimi pogoji smo uporabili enosmerno analizo variance (ANOVA), Tukeyjev post hoc preizkus pa smo uporabili za preverjanje razlik med posameznimi pogoji. Za preverjanje razlik glede na spol ter interakcije med čustvenim pogojem in spolom smo uporabili dvofaktorsko analizo variance (ANOVA). Razlike v ocenah med prvo in zadnjo polovico prikazanih slik smo preverili s parnimi t-testi, spreminjanje ocen skozi celotno zaporedje slik pa z linearno regresijsko analizo. Statistično značilnost razlik smo presojali pri ravni tveganja $p < 0,05$.

3 Rezultati

Za preverjanje razlik v interpretaciji nevtralnih obrazov glede na čustveni pogoj (video posnetek) in spol smo izvedli dvofaktorsko analizo variance (ANOVA). Rezultati so pokazali statistično značilen glavni učinek čustvenega pogoja, $F(2, 147) = 8,45$, $p < 0,001$. Analiza post hoc s Tukeyjevim preizkusom je pokazala, da se nevtralni pogoj statistično značilno razlikuje od negativnega ($p = 0,002$) in pozitivnega pogoja ($p = 0,001$), medtem ko med negativnim in pozitivnim pogojem ni bilo statistično značilne razlike ($p = 0,997$).

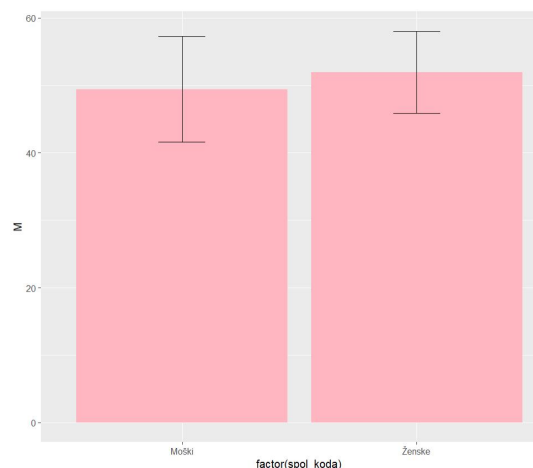
Povprečne ocene interpretacije obrazov so bile najnižje v nevtralnem pogoj, medtem ko so bile v negativnem in pozitivnem pogoju višje (slika 1).



Slika 1: Povprečna ocena interpretacije nevtralnih obrazov glede na čustveni pogoj

Ker rezultati niso bili povsem skladni s pričakovanji, smo izvedle dodatne analize, s katerimi smo želele preveriti morebitne vzorce v odgovorih udeležencev.

Rezultati so pokazali tudi statistično značilen glavni učinek spola, $F(1, 144) = 6,29$, $p = 0,013$. Udeleženke so v povprečju podale višje ocene interpretacije obrazov kot udeleženci (slika 2).



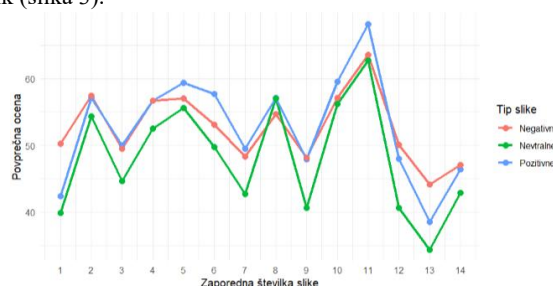
Slika 2: Povprečna ocena interpretacije obrazov glede na spol

Interakcija med čustvenim pogojem in spolom ni bila statistično značilna, $F(2, 144) = 1,65$, $p = 0,195$.

Prav tako nas je zanimalo, ali se ocene razlikujejo med začetkom in koncem naloge, zato smo primerjali povprečne ocene prve polovice prikazanih slik (slike B1–B7 v prilogi B) in druge polovice prikazanih slik (slike B8–B14 v prilogi B). Rezultati parnih t-testov niso pokazali statistično značilnih razlik v nobenem pogoj: pri negativnem pogoju $p = 0,134$, pri nevtralnem pogoju $p = 0,449$ in pri pozitivnem pogoju $p = 0,617$.

Poleg razlik med prvo in zadnjo polovico prikazanih slik nas je zanimalo tudi, ali se ocene sistematično spreminjajo skozi celotno zaporedje slik. Zato smo za vsak čustveni pogoj posebej izvedli linearno regresijsko analizo.

Linearni trend ni bil statistično značilen pri negativnem pogoj, $b = -0,31$, $p = 0,397$, pri pozitivnem pogoj, $b = -0,24$, $p = 0,662$, niti pri nevtralnem pogoj, $b = -0,34$, $p = 0,558$. Pri nobenem pogoju tako ni bilo razvidnega jasnega linearnega trenda naraščanja ali padanja ocen skozi zaporedje prikazanih slik (slika 3).



Slika 3: Povprečne ocene pozitivnih, negativnih in nevtralnih obrazov glede na zaporedno številko slike.

4 Razprava

Glavni namen pričujoče empirične raziskave je bil preučiti vpliv eksperimentalno izzvanega čustvenega stanja na interpretacijo nevtralnih obraznih izrazov, saj so ti posebej dovzetni za vpliv opazovalčevega notranjega afektivnega stanja [6, 13]. Rezultati so pokazali statistično značilen vpliv čustvenega pogoja na končne ocene obrazov, vendar hipoteza ni

bila potrjena v pričakovani smeri. To pomeni, da trenutno čustveno stanje vpliva na interpretacijo nevtralnih obrazov, vendar se ta vpliv ni pokazal v pričakovani smeri.

Ključna ugotovitev izhaja iz Tukeyjeve post-hoc analize, ki je pokazala, da se nevtralni pogoj statistično značilno razlikuje tako od negativnega kot od pozitivnega pogoja. Udeleženci v nevtralnem pogoju so obraze ocenjevali najnižje (najbolj negativno), medtem ko med pozitivnim in negativnim pogojem ni bilo značilnih razlik. Obe čustveni indukciji sta torej premaknili ocene navzgor. Ob tem obstaja metodološka možnost, da je bil nevtralni videoposnetek predolg ali dolgčasen. Dolgčas lahko deluje kot negativno afektivno stanje, ki je pri kontrolni skupini zmanjšalo motivacijo in povzročilo strožje ocenjevanje.

Dobljeni rezultati nasprotujejo klasični afektivni kongruentnosti [14], po kateri bi moralo slabo razpoloženje voditi do negativnih ocen, dobro pa do pozitivnih. Podatki močnejše podpirajo izsledke Manierka idr. [7], saj čustvena stanja pri zdravih odraslih ne krepijo nujno prepoznavanja skladnih čustev, temveč spremenijo kognitivno pristranskost (angl. bias). To lahko interpretiramo preko Zillmannove teorije transferja vzbujenja [18], umirjeni udeleženci iz nevtralne skupine so zaradi odsotnosti vzbujenja obraze ocenili realno negativno, medtem ko je pri pozitivnem in negativnem pogoju prišlo do podzvestnega prenosa preostanka telesne energije na dražljaje, kar je ocene premaknilo navzgor.

Ta prenos pojasnjuje tudi teorija socialnih učinkov čustev [16], po kateri afektivna aktivacija poveča usmerjenost v socialno okolje. V pozitivnem pogoju lahko višje ocene pripišemo večji sugestibilnosti, saj veselje zmanjšuje analitično globino prepoznavanja [16]. Pri negativnem razpoloženju pa gre verjetno za spontano regulacijo slabe volje ali učinek kognitivnega šuma [1], kjer preobremenitev z lastnim afektom zamegli subtilne razlike, kar je ocene pomaknilo bližje sredini lestvice. Neskladnost z avtorji, kot so Quarto idr. [9] ter P. C. Schmid in M. Schmid Mast [12], jasno kaže, da je interpretacija nevtralnih obrazov kvalitativno drugačen proces kot preprosto prepoznavanje eksplicitno izraženih čustev, saj zahteva globljo kognitivno projekcijo na dvoumne dražljaje.

Z analizo parnih t-testov smo preverili stabilnost učinka tekom naloge v aplikaciji Cognition.run. Primerjava prve in zadnje polovice slik ni pokazala značilnih razlik v nobenem pogoju. Odsotnost razlik potrjuje, da je bila indukcija razpoloženja z videoposnetki dovolj močna in stabilna skozi celoten eksperiment [6] ter da pri udeležencih ni prišlo do utrujenosti ali habituacije, zaradi česar so kognitivni procesi ostali konstantni.

Ker med pozitivnim in negativnim pogojem nismo ugotovili statistično značilnih razlik, smo v dodatnih analizah preverili tudi morebitni vpliv spola na ocenjevanje nevtralnih obraznih izrazov. Rezultati so pokazali statistično značilen vpliv spola, saj so ženske nevtralne obraze v povprečju ocenjevale bolj pozitivno kot moški. Podobne rezultate omenjajo tudi nekatere pretekle raziskave, ki kažejo, da med spoloma obstajajo določene razlike pri zaznavanju emocionalnih in socialnih signalov. Hall idr. [3] ugotavljajo, da ženske v povprečju nekoliko uspešneje interpretirajo afektivne dražljaje kot moški, pri čemer poudarjajo, da so te razlike sicer majhne, vendar precej konsistentne skozi različne raziskave. Avtorji menijo, da razlike niso nujno posledica splošno boljše uspešnosti žensk,

ampak bolj večje občutljivosti za emocionalne in socialne informacije.

Podobno tudi Rafiee in Schacht [10] ugotavljata, da ženske v povprečju uspešneje prepoznavajo obrazne izraze čustev kot moški. Njuni rezultati kažejo, da se razlike med spoloma pojavljajo pri različnih vrstah dražljajev, kar bi lahko bilo povezano s širšimi razlikami v socialnem zaznavanju in procesiranju emocionalnih informacij.

Pri interpretaciji naših rezultatov je pomembno upoštevati, da udeleženci niso ocenjevali izrazito emocionalnih obrazov, ampak nevtralne oziroma dvoumne obrazne izraze. Ker so bili obrazi nevtralni, jih je lahko vsak udeleženec interpretiral nekoliko drugače. Hoffmann idr. [4] so ugotovili, da so ženske uspešnejše pri prepoznavanju subtilnih obraznih izrazov, medtem ko pri izrazito intenzivnih emocionalnih izrazih razlik med spoloma skoraj ni bilo. To bi lahko delno pojasnilo tudi rezultate naše raziskave, saj je možno, da so ženske v nevtralnih obrazih zaznale več subtilnih socialnih ali emocionalnih značilnosti kot moški. Zaradi tega so njihove ocene pogostejše odstopale proti bolj pozitivnemu delu lestvice.

Razlike med spoloma bi lahko bile povezane tudi z večjo pozornostjo žensk do obraznih in medosebnih signalov, kar omenjajo nekatere raziskave socialnega zaznavanja. Hall idr. [3] navajajo, da ženske v povprečju kažejo višjo natančnost pri dekodiranju afektivnih signalov, kar povezujejo z večjo občutljivostjo za socialne informacije in medosebno komunikacijo. Ker so nevtralni obrazi manj jasno določeni kot izrazito veseli ali žalostni obrazi, je njihova interpretacija bolj odvisna od posameznika. Možno je, da so ženske zaradi večje občutljivosti za subtilne obrazne značilnosti obraze interpretirale manj negativno oziroma bolj prosocialno kot moški.

Kljub temu je rezultate potrebno interpretirati previdno. Pomembna omejitev raziskave je neuravnotežena spolna struktura vzorca, saj je bilo v raziskavi več žensk kot moških. Poleg tega razporeditev spolov med posameznimi pogoji ni bila popolnoma enakomerna, kar lahko vpliva na stabilnost ocen učinka spola. Zato rezultatov ne moremo brez omejitev posploševati na širšo populacijo.

Razlog za podrobnejši pregled rezultatov za vsako sliko posebej je izhajal iz predpostavke, da bo vpliv predvajanega videoposnetka najmočnejši pri prvi sliki, nato pa bo sčasoma postopoma upadal, dokler na koncu ne bo več imel vpliva. Vendar pa naši rezultati niso potrdili teh pričakovanj. Ker učinek ni upadal skladno s časovnim potekom, smo začeli preverjati vsako sliko posebej in na podlagi tega prišli do naslednjih zaključkov. Rezultati dodatne analize nakazujejo, da so bile nekatere slike morda sugestibilne same po sebi. Pri posameznih slikah so se namreč povprečne ocene udeležencev sistematično nagibale bodisi v bolj pozitivno bodisi v bolj negativno smer. To pomeni, da interpretacija obrazov ni bila nujno odvisna samo od eksperimentalno izzvanega čustvenega stanja, temveč tudi od značilnosti posamezne slike. Čeprav so bile slike v raziskavi obravnavane kot nevtralni dražljaji, graf kaže, da jih udeleženci niso vedno zaznavali povsem nevtrarno. To je pomembno pri razlagi rezultatov, saj lahko sugestibilnost posameznih slik delno pojasni odstopanja v povprečnih ocenah.

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Do Large Language Models Know When They Are Wrong? A Case Study of Confidence and Abstention Under Linguistic Corruption

Syed Muhammad Ali Abbas
Jožef Stefan Institute
Ljubljana, Slovenia
Syed.Muhammad.Ali.Abbas@ijs.si

Matjaž Gams
Jožef Stefan Institute
Ljubljana, Slovenia
matjaz.gams@ijs.si

Abstract

Self-reported confidence is useful only if it changes when model performance becomes unreliable. We study this as behavioral metacognitive monitoring using 60 matched reasoning problems presented in clean and severely corrupted form, derived from a 90-item stress-test benchmark. We compare GPT-5.6 Sol Medium and o3 in separate ChatGPT sessions using identical answer-plus-confidence prompts. Sol remained nearly invariant (100.00% clean vs. 98.33% corrupted accuracy), and its only corrupted error still received 98% confidence. o3 solved 95.00% of the clean problems but only 1.67% of the corrupted versions, a 93.33-point decrease; under corruption it produced 34 explicit “Unknown” responses and omitted 25 items. Exact paired testing showed a significant corruption-associated performance difference for o3 ($p < 0.001$) but not for Sol. The results reveal a sharp contrast between confidence saturation and abstention, and separate three aspects of LLM metacognitive behavior: robustness to degraded input, calibration of committed answers, and control over whether to answer.

Keywords

large language models, metacognition, confidence calibration, linguistic corruption, surface-form robustness, abstention, Brier score

1 Introduction

Metacognition concerns the monitoring and regulation of one’s own cognitive processes [1]. Classical accounts distinguish an *object level*, where a task is performed, from a *meta level* that monitors and can regulate object-level processing [2]. Confidence judgments provide an observable form of such monitoring, but confidence and objective performance need not coincide [3].

This distinction is increasingly important for large language models (LLMs). A model may be highly accurate on average yet remain almost certain on its rare failures. Conversely, a less robust model may signal uncertainty or abstain when an input exceeds its effective capabilities. Prior work shows that LLMs can verbalize uncertainty [4], can exhibit useful self-evaluation signals [5], and can support calibration and failure prediction when confidence is explicitly elicited [6, 7]. However, confidence is sensitive to elicitation and task design, and high-confidence errors remain possible [8].

A methodological problem is that many standard reasoning items are now too easy for strong models, yielding too few failures to examine confidence behavior. We therefore use composite linguistic degradation as a controlled stressor. Each stressed item has a matched clean reconstruction, so the same underlying reasoning problem can be evaluated with and without corruption.

We address two research questions:

RQ1: How does linguistic corruption affect surface-form robustness when the underlying reasoning problems and answers are held constant?

RQ2: How do self-reported confidence and response behavior differ between successful answers, committed errors, explicit abstentions, and omissions under linguistic corruption?

Our contribution is threefold: (i) a matched clean/corrupted stress-test design that holds the underlying reasoning problems constant, (ii) paired evidence of strongly different robustness profiles across model configurations, and (iii) a coverage-aware metacognitive analysis that separates committed errors from abstention. Throughout the paper, verbal confidence is treated as an observable behavioral metacognitive signal.

2 Related Work

Confidence elicitation is a common black-box approach to LLM uncertainty. Lin et al. showed that models can learn to express uncertainty in natural language [4]. Tian et al. found that verbalized confidence can be meaningfully calibrated in instruction-tuned models [6], while Xiong et al. distinguished aggregate calibration from failure prediction—the ability of confidence to distinguish likely correct from likely incorrect outputs [7]. These properties are not equivalent: mean confidence can be close to mean accuracy even when confidence barely changes on individual errors.

Robustness to noisy surface forms is a related but distinct problem. Zhao et al. evaluate 18 open-source LLMs under multilingual typographical errors and find substantial model- and task-dependent degradation [9]. Our manipulation extends beyond typos to deletion, token fusion, grammar removal, symbolic compression, and distractors, while pairing each corrupted reasoning item with the same clean problem.

Prompting and reflection can alter calibration [8], but monitoring does not automatically imply effective control; intrinsic self-correction can remain unreliable without external feedback [10]. Recent work has used metacognitive signals as control variables for tool use [11]. A recent survey frames LLM metacognition around monitoring and control [12], and related work examines how self-monitoring can guide test-time reasoning [13]. Our study focuses on response behavior under a matched linguistic stress manipulation.

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Table 1: Example of the matched linguistic manipulation (Q061).

Clean	Arrange A–G in positions 1–7 once each. D is immediately after B; A is immediately after D; F is before B; $A < G < C < E$; F is not adjacent to A; G is not first. Find the unique order.
Corrupted	7obj A..G /p1-7 uniq. D=B+1p; A=D+1p; F«B; A<G<C<E; pF-pA !=1; G!=p1. full seq?

3 Method

3.1 Benchmark and Matched Control

The full benchmark contains 90 independently scored items. Q001–Q030 are clean baseline problems. Q031–Q060 combine harder reasoning with irregular linguistic degradation, including character deletion, token fusion and splitting, omitted grammatical words, abbreviations, symbolic relations, and distractor fragments. Q061–Q090 intensify the degradation and use multi-step tasks such as constraint satisfaction, Bayesian inference, counterfactual reasoning, temporal dependencies, dynamic state tracking, graph reasoning, combinatorics, and symbolic transformations.

For every Q031–Q090 item, a separately maintained clean natural-language reconstruction and predetermined answer were created. The main experiment therefore contains 60 paired problems in two conditions: *clean* and *corrupted*. Logical content and answer key are held constant while the surface representation changes. Table 1 illustrates the manipulation.

3.2 Models and Procedure

Pilot testing showed contrasting response profiles under linguistic corruption. We therefore compare GPT-5.6 Sol Medium, which exhibited high robustness, with o3, which showed substantially greater sensitivity to the corrupted items. This contrast enables direct analysis of how confidence and abstention behave when two capable reasoning models respond differently to the same matched stressor. The label “Medium” denotes the reasoning-effort setting displayed in ChatGPT at test time.

All reported runs were conducted in the ChatGPT interface on 26 August 2026; model labels are reported exactly as displayed at test time. Clean and corrupted conditions were run in separate sessions with the same minimal prompt requiring one answer and an integer confidence score from 0–100 for every ID. Visible explanations were suppressed to keep the output format identical across models and make confidence scoring directly comparable. Models were not told that the clean items reconstructed previously corrupted questions.

Scoring followed the predetermined answer key. Numerically equivalent answers and reasonable rounding differences were accepted. Extra continuation information was accepted when it contained the requested answer. Explicit “Unknown” responses and omissions were incorrect for required-answer accuracy, but were tracked separately rather than treated as ordinary wrong attempts.

3.3 Metrics

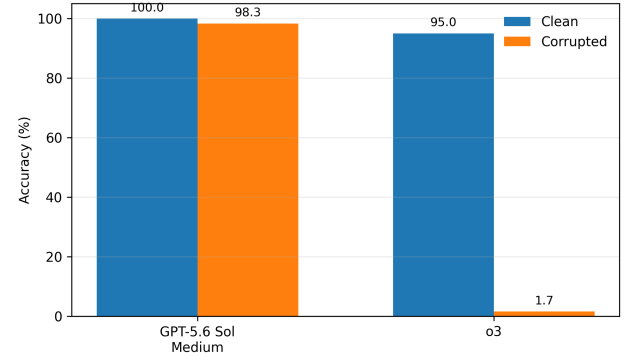
For item i , correctness is $y_i \in \{0, 1\}$ and confidence is $c_i \in [0, 1]$. Accuracy is

$$\text{Accuracy} = \frac{1}{N} \sum_{i=1}^N y_i. \quad (1)$$

Table 2: Matched Q031–Q090 results. Confidence is averaged over returned rows; Brier score is calculated only on concrete attempts.

Model	Cond.	Acc.	Out.	Commit	Conf.	BS (n)
Sol	Clean	100.00	100.00	100.00	100.00	0.0000 (60)
Sol	Corr.	98.33	100.00	100.00	98.50	0.0165 (60)
o3	Clean	95.00	96.67	96.67	90.86	0.0218 (58)
o3	Corr.	1.67	58.33	1.67	11.71	0.0900 (1)

Acc., Out., Commit, and Conf. are percentages. Out.=any returned row; Commit=concrete-answer coverage. The corrupted o3 Brier estimate is based on one concrete answer and is not stable. Wilson 95% CIs for accuracy are Sol clean [94.0,100], Sol corr. [91.1,99.7], o3 clean [86.3,98.3], and o3 corr. [0.3,8.9].

**Figure 1: Required-answer accuracy on the same 60 reasoning problems in clean and corrupted form.**

For concrete answer attempts, we compute the Brier score [14],

$$BS = \frac{1}{M} \sum_{i=1}^M (c_i - y_i)^2, \quad (2)$$

where lower is better. “Unknown” and omitted items are excluded from the primary Brier score because they do not contain a concrete proposed solution. We additionally report output coverage, concrete-answer coverage, and response type counts. Because clean and corrupted conditions contain the same 60 items, we use the exact McNemar test [15] for paired changes in correctness.

4 Results

4.1 Matched Clean vs. Corrupted Performance

Table 2 summarizes the matched-condition metrics. Figure 1 shows a strongly model-specific corruption effect. Sol solved all 60 clean items and 59 of 60 corrupted items, a decrease of only 1.67 percentage points. o3 solved 57 of 60 clean items but only one of 60 corrupted items, a 93.33-point decrease. The same underlying reasoning problems were therefore highly solvable by o3 when written clearly, but not when their surface form was heavily degraded.

The paired analysis supports the same conclusion. For Sol, only one item changed from correct when clean to incorrect when corrupted, with no changes in the opposite direction (exact McNemar $p = 1.0$). For o3, 56 items changed from correct to incorrect and none changed from incorrect to correct ($p < 0.001$). Thus the matched data show a large corruption-associated performance difference for o3 but not for Sol.

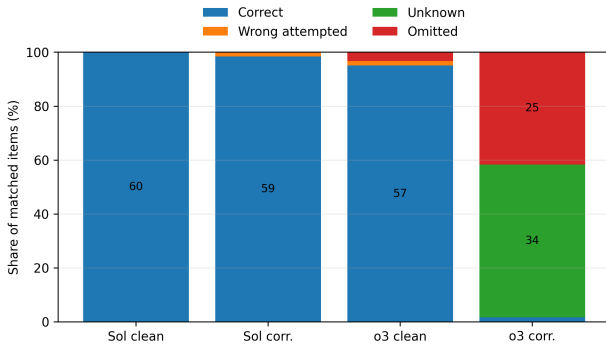


Figure 2: Response outcomes on the matched clean and corrupted conditions. Numbers inside large segments are item counts.

Table 3: Confidence by response type. Values in parentheses are item counts.

Model	Cond.	Correct	Wrong attempt	Unknown
Sol	Corr.	98.51 (59)	98.00 (1)	–
o3	Clean	90.96 (57)	85.00 (1)	–
o3	Corr.	70.00 (1)	–	10.00 (34)

4.2 Response Policy and Confidence

The two models also differed in how they failed. Sol continued to provide concrete answers in both conditions. Its only corrupted failure was an incomplete reconstruction of a personal name and received 98% confidence. o3 produced 57 correct answers, one concrete error, and two omissions in the clean condition. Under corruption it produced one correct concrete answer, 34 explicit “Unknown” responses, and 25 omissions (Fig. 2). Its concrete-answer coverage therefore fell from 96.67% to 1.67%.

Sol’s aggregate calibration remained strong: its Brier score rose from 0.0000 clean to 0.0165 corrupted. However, Table 3 shows why aggregate calibration alone is insufficient for metacognitive interpretation: its rare error received almost the same confidence as its correct answers.

For o3, the dominant metacognitive signal under corruption appears in *response control*: heavy corruption shifted the model from answering to low-confidence abstention and omission. Its only clean committed error received 85% confidence, while the corrupted condition contained too few committed wrong answers to characterize error-level discrimination. Mean confidence across returned rows fell to 11.71%, reflecting the large number of explicit “Unknown” responses and the accompanying drop in answer coverage.

4.3 Illustrative Error Cases

The few committed errors help clarify what the aggregate metrics do and do not measure. Sol’s only corrupted error occurred on Q046, a working-memory item in which the name *Saniya* appeared in degraded form. Sol correctly tracked the relevant person but returned the incomplete reconstruction “Sniya” with 98% confidence. The clean version of the same item was answered as “Saniya” with 100% confidence. This is primarily a linguistic reconstruction failure, not a failure of the ordering operation itself.

o3’s only concrete clean error occurred on Q082, a multi-step symbolic string transformation. It returned “HNWBQU” rather

than “HNWBQU” with 85% confidence. Under corruption, however, o3 did not produce a corresponding pool of confidently wrong transformed answers: after Q031 it largely switched to “Unknown” and later omissions. The comparison therefore supports a distinction between *confidence on a committed solution* and *willingness to commit*.

5 Discussion

The matched control changes the scientific interpretation compared with a simple difficulty-tier experiment. o3 can solve the underlying Q031–Q090 problems at 95% accuracy when they are clean, yet required-answer accuracy falls to 1.67% when the same logical content is heavily corrupted. Sol is nearly invariant to the manipulation. The composite linguistic corruption therefore produces a large, model-specific robustness effect rather than a uniform increase in reasoning difficulty.

The title question receives a differentiated answer. Sol combines very high robustness with confidence saturation: its aggregate Brier score is excellent, but its sole failure remains at 98% confidence. o3 expresses uncertainty in a different way: under corruption it shifts strongly from answering to explicit abstention and omission. These contrasting profiles show that metacognitive behavior can appear both in confidence assigned to a solution and in control over whether to commit to one. They motivate separating three properties: *surface-form robustness*, *calibration of committed answers*, and *abstention/coverage behavior*.

This separation matters methodologically. Collapsing “Unknown”, omission, and wrong attempts into one incorrect category would make o3 appear to have excellent error-level confidence sensitivity, because most failures carry 10% confidence. That conclusion would be misleading: the low values accompany abstentions, not a large sample of committed wrong solutions. Conversely, a small mean confidence–accuracy gap for Sol could hide a near-certain individual error. Confidence metrics should therefore be interpreted jointly with response coverage and response type.

The findings also show that benchmark difficulty is model-dependent. The same linguistic stressor is nearly harmless to Sol but produces a dramatic change in o3’s accuracy and response policy. Matched clean/corrupted controls therefore provide a useful way to distinguish the difficulty of the underlying reasoning problem from sensitivity to its surface representation.

Beyond this benchmark, the result has a practical implication for LLM evaluation: accuracy alone cannot distinguish a model that confidently commits to an answer from one that recognizes difficulty by withholding a response. Jointly reporting correctness, confidence, and coverage provides a richer view of model behavior under degraded inputs and makes qualitatively different failure modes visible.

6 Limitations and Future Work

This focused study examines two contrasting model configurations under a composite linguistic stressor. The paired within-item design establishes the reported robustness contrast on this benchmark; broader model families and repeated runs will test how widely the pattern generalizes. Future work will also separate individual corruption types and add human readability calibration. Because the experiments used ChatGPT, backend decoding parameters were not directly observable. The matched question pairs, prompt, answer key, and scoring protocol are archived with the study to support reproduction and extension.

7 Conclusion

On 60 matched reasoning problems, linguistic corruption had almost no effect on GPT-5.6 Sol Medium but reduced o3 required-answer accuracy by 93.33 percentage points despite 95% clean accuracy on the same items. Sol remained highly robust and almost maximally confident, including on its rare failure, whereas o3 shifted primarily toward low-confidence abstention and omission. These contrasting profiles support a three-part view of behavioral LLM metacognition: robustness to degraded input, calibration of committed answers, and control over whether to answer. Evaluating these dimensions jointly reveals behavior that accuracy or mean confidence alone would miss.

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The Impact of Artificial Intelligence on the Epistemic Structure of Modern Science

Prof. Dr. Franc Mali

University of Ljubljana – Faculty of Social Sciences

Abstract

In this paper, we first focus on how the rapid integration of AI into scientific research processes is leading to an epistemic transformation of established scientific categories and principles that have been deeply rooted in our understanding of science since the modern scientific revolution of the mid-seventeenth century. In the second part, we address the implications of these epistemic changes for scientists' ability to explain and interpret AI outputs (e.g., predictions and explanations). For the first time in the history of human thought, the question of who counts as a "knower" in science and what counts as a legitimate "epistemic operation" has become open in ways previously unknown. With a touch of irony, one might say that we are at a turning point in human history at which scientists increasingly assume the role of students, while machines take on the role of teachers. Indeed, many solutions generated by machines contain new ideas and strategies that humans must learn from AI.

Keywords

AI-driven science, epistemology, scientific prediction, AI black box, explainability of AI outputs, closed-loop AI science cycle

1 Introduction

Artificial intelligence (AI)¹ is rapidly making its way into every sphere and every level of scientific research. AI is not only changing the speed at which research is conducted—something that everyone working in science is already enthusiastic about—but is also changing our very understanding of what constitutes scientific knowledge, how such knowledge can be demonstrated and explained, and how it can serve as a basis for scientific predictions and explanations. Throughout the centuries, there have been ongoing epistemological debates among theoreticians of science concerning the questions of what scientific knowledge is, how it is formed and justified, and under what conditions it emerges. Of course, the importance attached to each of these questions has varied depending on the historical context. However, with the entry of AI into scientific research processes, we find ourselves at an entirely new turning point. This turning point invites us to rethink our position as scientists in processes of knowledge production.

In this regard, we could say that if Nicolaus Copernicus displaced human beings from the centre of the cosmos and
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Charles Darwin displaced them from their privileged place in nature, AI now seems to be "dethroning" human beings from their position as the only intelligent entities. Alan Turing's assumption from more than 70 years ago—namely, that human beings might not embody the only possible form of intelligent and rational agency—seems to have become increasingly relevant in recent years. To be clear, contradictory views still exist among experts as to whether such a situation will arise in the near future or whether it has, to some extent, already arisen. Nevertheless, after all these transformations, the role of scientists as knowledge workers can no longer remain the same as it was in the past.

In the first part of our discussion, we will focus on how the rapid integration of AI into scientific research processes is leading to an epistemic transformation of established scientific categories and principles that have been deeply rooted in our understanding of science since the modern scientific revolution of the mid-seventeenth century. In the second part, we will address the implications of these epistemic changes for scientists' ability to explain and interpret AI outputs (e.g., predictions and explanations). With a touch of irony, one might say that we are at a turning point in human history at which scientists must learn from machines. Many solutions generated by machines contain new ideas and strategies that humans must learn from AI.

2 Some Points of Difference Between New AI-Based and Traditional Epistemology of Science

Very generally speaking, the epistemic structures underlying contemporary scientific knowledge can still be traced back to the well-known Kantian distinction between a priori and a posteriori knowledge. The former type of knowledge has traditionally been regarded as independent of experience (e.g., mathematical truths), whereas the latter is regarded as knowledge that relies on empirical evidence (e.g., human experience and observations made using scientific instruments). This means that, after Kant, the concept of the epistemic justification of scientific knowledge evolved in the context of various epistemological theories, such as empiricism, rationalism, positivism, inductivism, deductivism, falsifiability, hermeneutics, or combinations of these approaches [1].

However, AI appears to disrupt these basic pillars of the traditional epistemological view. AI models are transforming the very architecture of modern scientific knowledge production [2] [3] [4] [5]. Unlike traditional epistemology, which derives its explanatory and predictive power from empirically or theoretically grounded laws, AI-based epistemology relies primarily on principles of probability. Before discussing this

¹ Although I use the term AI inclusively, in this discussion it refers particularly to its most recent developments over the last few years, including analytical tools such

as transformers, large language models (LLMs), and multimodal generative models that rely on techniques such as gradient descent.

radical transformation brought about by AI, we need to address some of the reasons why it is occurring. Let us mention two significant reasons.

First, the question of who counts as a “knower” in science and what counts as a legitimate “epistemic operation” has suddenly become open in ways previously unknown. With AI, the very architecture of knowledge production is being transformed [6]. For example, large language models (LLMs) have begun to (self-)learn from vast corpora of textual data, allowing them to extract patterns and semantics directly from real-world human language use. Second, generative AI has brought about an extraordinary increase in the capacity to solve complex problems across all domains of science. It has also demonstrated its capacity in other spheres of human life to cope with complex, nonlinear, sometimes unstable, and often self-organizing systems in nature, technology, and society [7].

The claim that the complex nature of the phenomena under investigation inherently calls for the assistance of AI can be illustrated by numerous practical cases. For example, given the impressive recent results achieved by AI models in solving complex mathematical problems, it seems that machines are encroaching on one of the last intellectual bastions of humankind. About four years ago, the first versions of LLMs could not even count properly. They subsequently began solving all kinds of school-level mathematical problems, followed by problems in university mathematics. They went on to solve all the problems of the Mathematical Olympiad. In the last year, they have succeeded in solving mathematical puzzles that had long stumped even the world’s best researchers (e.g., the latest LLMs by OpenAI disproved a conjecture formulated by the Hungarian mathematician Paul Erdős in 1946 [8]. Jacob Tsimmerman, who has recently been awarded the Fields Medal, an honour comparable to the Nobel Prize, has said in an interview with *Neue Zürcher Zeitung*: “Mathematics can’t go back to the pre-AI era. For centuries, mathematics had been an economy of scarcity: proofs of new theorems were rare and therefore represented the ultimate goal for mathematicians. Now, an age of abundance is beginning. AI systems are producing correct mathematical proofs on an assembly line” [9].

3 Epistemic Transformation in AI-Driven Science: Predictions Without a Theoretical Foundation, Relying Solely on Big Data and Algorithms

The radical epistemic shift in contemporary science resulting from the emergence of AI can best be observed and evaluated through the transformation of basic epistemological categories, such as scientific prediction, scientific explanation, causality, and probability. Let us consider the category of scientific prediction. Theoreticians of science often state that the predictive power of modern science is one of its defining features [10] [11]. Faith in the predictive power of science was initially based on the expectation that scientific knowledge would eliminate chance and thereby bring nature or society under full control. The most rigorous version of this view was already advocated by classical deterministic thinkers. For example, the French mathematician Pierre-Simon Laplace argued that if we possessed complete

knowledge of our world, we would be able to attain a comprehensive understanding of both past and future events.

In modern theories of science, such strict determinism is no longer heuristically productive. Modern scientific predictions are not formulated in the spirit of Laplace’s omniscient demon; rather, they are usually interpreted as inductively generalized conclusions (in the spirit of Hume’s inductivism [12]) or as deductive inferences aimed at falsifying or confirming theoretical hypotheses (in the spirit of Popper’s critical rationalism [13]).

Nevertheless, despite all these methodological variations, the epistemic structure of modern science is grounded in one common principle: the assumption that predictions are always grounded in subject-specific knowledge and, in this sense, are theory-based. As Jan C. Schmidt puts it: “Zwar mögen Prognosen mitunter auf statistischen, nicht auf deterministischen Gesetzmäßigkeiten aufbauen und somit probabilistisch sein, immer jedoch basieren sie auf einem Gegenstandswissen und sind in diesem Sinne theoriebasiert” [14]. Predictions therefore play an important role in processes of planning and decision-making. Auguste Comte, a classical sociological theorist, already expressed the following idea: to know in order to predict, to predict in order to act.

With AI, an epistemic transformation of prediction is taking place. Predictions in the context of AI are probabilistic by design. Although AI models remain strongly oriented towards forecasting, they enable predictions without necessarily providing a theoretical justification for their statements about the future [15]. Even when the newest AI models produce extremely reliable predictions within a particular scientific domain, this does not necessarily mean that they understand the broader underlying principles behind those predictions. Unlike the epistemological assumptions of traditional science—which derives its predictive power from established, empirically validated, and theoretically grounded knowledge about the phenomenon being predicted—the AI forecasting process relies primarily on probability.

In the context of AI forecasting, probabilistic predictions are based on big data and the use of correlations. These data-driven, theory-free predictions show some similarities to inductive reasoning. However, this does not amount to full-fledged inductivism, which aims to infer all future observations from a finite number of measurements and thereby derive general laws [12]. They are therefore distinct from predictions derived from classical deterministic or contemporary stochastic models, which are assumed to be theoretically grounded and constructed on the basis of an understanding of the underlying regularities governing natural or social systems.

As many theoreticians of science have observed, AI models provide algorithms that are primarily oriented towards forecasting (and, on this basis, towards decision-making processes), rather than towards extracting explanatory information, whether causal or otherwise [16], [17], [18]. The existence of causal relationships is, at best, merely assumed, without such connections actually being identified or understood. As Veda C. Storey notes, the probabilistic nature of AI models means that their outputs will vary in ways that are not—and perhaps never will be—fully explainable.

Several practical cases demonstrate that even when current AI systems produce reliable predictions within a particular scientific

domain, this does not necessarily mean that they understand the broader underlying principles behind those predictions. For example, a recent study showed that a generative AI model was able to predict the motion of a planet orbiting a star, yet it was unable to reconstruct the fundamental physical laws governing the motion of these celestial bodies [19]. This situation contrasts with cases from the beginnings of modern natural science. Centuries ago, astronomers such as Johannes Kepler discovered geometric regularities that enabled accurate predictions of the future positions of planets. Isaac Newton later built upon these discoveries to formulate fundamental physical laws that not only allowed for the prediction of planetary motion but also explained the physical principles governing the universe more broadly.

This means that, in the epistemology of classical natural science, it was assumed to be possible to move from predicting sequences to understanding the deeper mechanisms that generate them. According to Kaiser and co-authors, the emergence of accurate predictions that are not directly derived from highly intelligible theories can also be illustrated by the case of AlphaFold 2 [20]. AlphaFold 2 is an algorithm that uses deep learning to predict protein folding with superhuman accuracy but cannot directly produce theoretical contributions to the science of protein folding. The list of such cases is long and extends across different scientific fields, from physics and biotechnology to oceanography and climate science.

The changing epistemic structure of AI-based science remains a relatively unexplored theoretical topic and requires much greater attention. AI models based on self-supervised learning have great potential for solving various scientific problems because they can leverage massive amounts of unlabelled data and transfer their knowledge to low-data regimes. However, these transfer-learning schemes can be ad hoc, lack theoretical guidance, and remain vulnerable to shifts in underlying distributions.

4 AI-Driven Science Reconfigures Both the Role of Scientists in the Research Process and the Epistemic Function of Machines

Even before the emergence of generative AI (GAI), various applications of machine-learning models in science were already raising questions about the relationship between humans and machines. Even experts in the field did not have complete access to all aspects of the functioning of machine-learning models. They did not necessarily understand the pathways through which these models proceeded from input to output. For example, Jenna Burrell wrote that classifications in traditional AI models were considered opaque in the sense that, if one was a recipient of an algorithm's output—that is, its classification decisions—one rarely had any concrete sense of how or why a particular classification had been derived from the inputs [21]. With regard to the question of opacity deriving from the internal “logic” of traditional machine learning, Jenna Burrell distinguished among three forms of opacity: (1) opacity as intentional corporate or state secrecy, (2) opacity as technical illiteracy, and (3) opacity

arising from the characteristics of machine-learning algorithms and the scale required to apply them usefully.

Many solutions generated by traditional machine learning contained strategies that humans had to learn from machines. Nevertheless, the increased integration of GAI into scientific practice over the past few years has led to a situation in which the question of who counts as a “knower” in the research process and what counts as a legitimate “epistemic operation” has suddenly become open in ways not seen since the modern scientific revolution. With a touch of irony, one might say that we are at a turning point in human history at which scientists increasingly assume the role of students, while machines take on the role of teachers.

The new epistemic structure of AI-driven science has significant implications for the question of how scientists can achieve explainability of AI outputs. Scientists, like other users, often find themselves in situations in which they rely on AI strategies that they do not fully understand. They trust the achieved goals and empirical payoffs, but not necessarily the methodological derivations. In other words, they are impressed by the operational efficiency of AI models but cannot fully explain how the outputs have been generated or which inputs have been critical in producing them. For scientists, AI models therefore operate as “black boxes.”

In the expert literature, we encounter various suggestions for how to address the problem of bringing transparency to the existing AI “black box.” For example, Richard Heersmink and co-authors differentiate among three notions of transparency intended to facilitate explanations of the inner “logic” of AI: reflective, phenomenological, and informational transparency [5]. We will not engage in a more detailed discussion of this issue here.

The lack of explainability and interpretability² of the AI “black box” can lead to numerous negative practical consequences (e.g., a lack of trust among users), legal consequences (e.g., difficulties for regulatory bodies in determining whether a particular system processes data fairly and securely), and, last but not least, negative epistemological and methodological implications. With regard to the negative epistemological and methodological implications, it is important to highlight problems such as the inability to properly assess biases, difficulties in correctly interpreting model results, and limited applicability in areas where model outputs must be understood prior to real-world implementation.

When it comes to real-world applications, the issue of AI transparency becomes particularly significant. The degree of transparency, for instance, directly affects the extent to which we can place trust in AI systems deployed in high-stakes contexts, such as autonomous driving and medical diagnosis. An additional factor contributing to the lack of transparency is that proprietary AI models, which are controlled by large AI corporations, largely obscure their training data and design choices. Their susceptibility to external scrutiny is therefore limited. Open-source AI models are more transparent, but they require significant computational resources, which are unevenly

² Daniel Giacobbe and coauthors insist that, in order to fully understand the challenges and opportunities associated with explainability, a distinction should be made between interpretability and explainability [22]. A model is interpretable when each step in the computations leading to the eventual prediction, as well as

the relative contribution of the different features, can be easily inferred from a “white-box” model, whereas explainability refers to attempts to explain, as far as possible, how a “black-box” model produces its output. In this sense, interpretability can be understood as full explainability.

distributed across countries and institutions. The lack of such resources can create risks of misuse and misinterpretation.

In any case, the AI black box is not merely a technical issue. It represents a major epistemic challenge for modern science. Will scientists still be motivated to deepen their explanations of the natural and human worlds once AI reaches the level of general human intelligence? As stated by Hector Zenil and co-authors, the integration of new information into the corpus of existing scientific knowledge remains one of the most intellectually demanding aspects of scientific discovery [23]. Here, we encounter not only the challenge of simply appending new data to old knowledge but also the challenge of reconciling and reinterpreting existing knowledge and even overturning entire paradigms. In the context of AI-led discovery based on algorithms and big data, such reconciliation and reinterpretation cannot be taken for granted.

As we have already argued, we are reaching a point at which GAI-driven science is beginning to evolve according to a “logic” that human scientists can exploit but no longer fully understand. Scientists are currently faced with the dilemma of how much control to relinquish in order to accelerate discovery while keeping outputs relevant to humans. But what will happen in the future if GAI models take over the entire process of scientific research? Trends towards the development of GAI-driven science in which models autonomously perform tasks across the entire research pipeline—from reviewing the literature on a given topic and formulating hypotheses to testing solutions, writing scientific papers, and ultimately even carrying out peer-review tasks—are becoming increasingly evident.

If and when we enter such a closed-loop AI science cycle, even greater uncertainty will arise regarding the explainability of AI-generated scientific outputs. Will scientists ultimately be entirely excluded from the explainability and interpretability of AI-generated scientific outcomes? It must be acknowledged that “AI Scientist” models tested in the field of machine-learning research have already demonstrated the ability to autonomously perform tasks across such closed-loop cycles. For all the reasons mentioned above, we need to prevent AI models from completely replacing human scientists in processes of scientific discovery. Instead, we need a form of development in which human interpretative depth and ethical awareness, on the one hand, and machine speed and memory, on the other, can coexist and co-evolve.

5 Conclusion

In our discussion, we have sought to point out that the recent development of AI-driven science is leading to significant changes in the epistemic structures of modern science. To understand these changes, it is necessary to examine the concrete methodological tools used in science. We have directed our attention to the changing role of scientific prediction. Considering that, from antiquity onwards, people have sought to foresee the future and predict forthcoming events, it is not surprising that the strong functional relationship between prediction and theoretical explanation is also highly relevant in modern science. However, with the emergence of generative AI,

an epistemic transformation of prediction is taking place. AI predictions rely on statistical correlations without necessarily being provided with a strong explanatory basis. In this paper, we have sought to show how these changes are occurring and what their current and potential future implications may be for scientists’ ability to explain and interpret AI outputs.

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Primernost mer FPR in FNR kot kriterija pravičnosti v strojnem učenju*

Assessing the Suitability of FPR and FNR as Fairness Metrics in Machine Learning

Ana Farič†

Kognitivna znanost
Univerza v Ljubljani, Pedagoška fakulteta
Ljubljana, Slovenija
ana.faric@fri.uni-lj.si

Ivan Bratko

Univerza v Ljubljani, Fakulteta za računalništvo in informatiko
Ljubljana, Slovenija
ivan.bratko@fri.uni-lj.si

Povzetek

Sistemi strojnega učenja so v družbeno kritičnih domenah pogosto obtoženi pristranskosti, kar se navadno utemeljuje z asimetrijo napačne pozitivne (FPR) in napačne negativne mere (FNR) med demografskimi skupinami. To je bil tudi glavni argument o pristranskosti sistema COMPAS v znamenitem članku v ProPublici. Vendar v tem prispevku pokažemo, da so razlike v omenjenih merah neizogibna matematična posledica različnih osnovnih stopenj pojava in porazdelitve pomembnih atributov v učnih podatkih. Z analizo realne podatkovne zbirke ProPublica empirično kažemo, da lahko zgolj s spremembo demografske strukture asimetrijo napak izničimo ali celo popolnoma obrnemo. Z analizo vseh možnih uravnoteženih porazdelitev dodatno kažemo, da kriterij izenačenih možnosti, izražen z merami FPR in FNR, pogosto verjetno ni realen za praktično uporabo. Zaključujemo, da sta meri nezadosten in potencialno zavajajoč kazalnik, če ju ne interpretiramo v kontekstu osnovnih stopenj in porazdelitve podatkov.

Ključne besede

Strojno učenje, COMPAS, pristranskost, napačna negativna mera, napačna pozitivna mera

Abstract

Machine learning systems in socially critical domains are frequently accused of bias, which is typically justified by the asymmetry of the false positive (FPR) and false negative rate (FNR) across demographic groups. This was also the main argument against the COMPAS system in the famous paper in ProPublica. Our paper shows that disparities in these measures are an inevitable mathematical consequence of differing base rates and the distribution of important attribute values within the training data. Through the perturbation of the real ProPublica dataset, we empirically demonstrate that altering the

demographic structure alone can eliminate or completely reverse the error asymmetry. Through the analysis of all possible balanced distributions, we further show that the fairness criterion expressed by the FPR and FNR measures is likely unrealistic for practical use. We conclude that the two measures are an insufficient and potentially misleading indicator if they are not interpreted in the context of base rates and the distribution of data.

Keywords

Machine learning, COMPAS, machine bias, false negative rate, false positive rate

1 Uvod

Ko sistemi strojnega učenja vstopajo v družbeno kritične domene, kot je pravosodje, postaja pristranskost pogost raziskovalni problem, ki ga zaznamujeta manjko univerzalne definicije [10] in nasprotujoči kriteriji pravičnosti [4][17]. V literaturi jasne definicije pogosto ali niso podane ali pa so pomanjkljivo opredeljene [14]. V splošnem lahko pristranskost razumemo kot razliko v obravnavi posameznikov ali skupin glede na neko lastnost, kot je spol ali rasa [20].

Prediktivno pravosodje (angl. *predictive justice*) vključuje modele za napovedovanje in podporo sodnim odločitvam [21], med katerimi so ključni instrumenti za oceno tveganja povratništva (angl. *risk assessment instruments*). Njihova naloga je identifikacija posameznikov, ki bodo najverjetneje ponovili kaznivo dejanje [15]. Pogosto temeljijo na veliki količini podatkov in na podlagi vrednosti različnih atributov osumljenca izračunajo verjetnost oz. oceno tveganja povratništva. Takšne napovedi se nato uporabljajo pri različnih kazenskih postopkih, od odločanja o varščini do izreka kazni [2].

COMPAS (*Correctional Offender Management Profiling for Alternative Sanctions*) je eden najbolj znanih instrumentov za oceno tveganja. V številnih zveznih državah ZDA, vključno z New Yorkom, Wisconsinom, Kalifornijo in Florido, se od leta 2000 uporablja za ocenjevanje tveganja povratništva [8][9]. Deluje na podlagi algoritma, ki analizira 137 atributov in poda oceno od 1 do 10, pri čemer višja ocena pomeni večjo verjetnost, da bo posameznik v roku dveh let ponovil kaznivo dejanje [5][18].

*Article Title Footnote needs to be captured as Title Note

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Leta 2016 je odmeven članek v ProPublici [1] sprožil razpravo o COMPAS-ovi rasni pristranskosti. Njihova analiza je temeljila na dveh merah uspešnosti modela:

Napačna pozitivna mera (angl. *False Positive Rate* – FPR) pomeni delež dejansko negativnih primerov, ki jim je model napačno napovedal pozitiven razred. Pozitiven razred je definiran kot povratništvo. Izračuna se tako, da število napačnih pozitivnih napovedi (angl. *False Positives* – FP) delimo s številom vseh resnično negativnih primerov, tj. vsoto FP in pravih negativnih napovedi (angl. *True Negatives* – TN):

$$FPR = \frac{FP}{FP + TN}$$

Napačna negativna mera (angl. *False Negative Rate* – FNR) pomeni delež dejansko pozitivnih primerov, ki jim je model napačno napovedal negativni razred. Izračuna se tako, da število napačnih negativnih napovedi (angl. *False Negatives* – FN) delimo s številom vseh resnično pozitivnih primerov, tj. vsoto FN in pravih pozitivnih napovedi (angl. *True Positives* – TP) [3]:

$$FNR = \frac{FN}{FN + TP}$$

Angwin idr. [1] so ugotovili, da je FPR za temnopolte posameznike skoraj dvakrat višji (44,9 %) kot za belce (23,5 %), medtem ko je FNR bistveno višji za belce (47,7 %) kot temnopolte (28 %). Uporabili so kriterij izenačenih možnosti (angl. *equalized odds*), ki zahteva, da imajo skupine enake vrednosti mer FPR in FNR. Od tedaj se različni vrednosti FNR in FPR med skupinama pogosto avtomatsko sprejme kot jasen dokaz pristranskosti.

Javne razprave [13] in veliko študij [6][8][9][16][19], ki se ukvarjajo s pristranskostjo, podpirajo zaključek Angwin idr. [1], da je COMPAS pristranski. Poleg tega mu upravičeno očitajo še netransparentnost (t. i. problem črne škatle, na katerega opozarja Rudin [22]) in slabo točnost, ki po ugotovitvah Dressela in Farida [8] ni boljša od ocen neekspertov.

Zanimivo je, da predhodne raziskave [4][7][8][12][17], ne glede na njihov zaključek o COMPAS-ovi pristranskosti, konsistentno reproducirajo zloglasno asimetrijo v vzorcu napak med skupinama, pogosto pa manjka globlji razmislek o tem, zakaj do asimetrije sploh pride. V nadaljevanju se posvečamo mehanizmom, ki ta vzorec generirajo, in raziskujemo, ali sta omenjeni meri primerna kazalnika pravičnosti modelov.

2 Sintetični scenarij

Pomemben del strojnega učenja je iskanje vzorcev v učnih podatkih in optimizacija točnosti. Zamislimo si ekstremno preprost scenarij. Imamo množico primerov, izmed katerih je 60 % pozitivnih in 40 % negativnih, model pa nima na voljo nobenih atributov. Model bo naredil edino smiselno potezo (alternativa je naključna klasifikacija) in vsem novim primerom napovedal večinski (pozitiven) razred. Neizogibna posledica bo ogromno število napačno pozitivnih primerov (FPR). Po kriteriju izenačenih možnosti je takšen model pristranski, čeprav je jasno, da gre v tem primeru zgolj za matematično optimizacijo napovedne točnosti.

Da bi izolirali mehanizme, ki prispevajo k asimetriji v merah FNR in FPR pri bolj kompleksnih modelih, smo ustvarili sintetičen primer. Znano je, da že zgolj razlika v osnovni stopnji pojava (npr. različna stopnja kriminalitete) poruši simetrijo mer FPR in FNR [4][7][17]. Vendar pa naslednji sintetični scenarij razkriva še en pomemben in pogosto premalo raziskan mehanizem porazdelitve atributov.

Ustvarimo podatkovno zbirko (N = 2400), kjer imamo dve enako veliki skupini (A: N = 1200 (rdeča barva) in B: N = 1200 (zelena barva)). Na voljo imamo dva atributa, ki se v pravni literaturi kažeta kot najbolj povedna za napovedovanje povratništva [22]. Gre za število predhodnih kaznivih dejanj in starost. Število predhodnih dejanj je tu obravnavano binarno: največ eno (0–1), dve ali več (2+). Starost obravnavamo kot ternarni atribut: starostna kategorija (mlajši, srednji, starejši). Pri tem sledimo pravilu, da imajo mlajši posamezniki z več predhodnimi dejanji večjo verjetnost za pozitivno napoved (+). Skupini imata enako stopnjo povratništva (600 povratnikov in 600 nepovratnikov; 50 %) in distribucijo predhodnih kaznivih dejanj (300 posameznikov iz vsake skupine ima 0–1, 300 pa več kot 2 kaznivi dejanji). Skupini se razlikujeta zgolj po starostni strukturi (skupina A je mlajša od skupine B in ima 200 primerov več v mlajši kategoriji). Model za vsako od šestih kombinacij atributov napove pozitiven (+) oziroma negativen (–) razred (Tabela 1).

Če za takšen model izračunamo mere uspešnosti, opazimo asimetrijo v FPR in FNR merah (Tabela 1). Ker je mladost pomemben dejavnik tveganja, model vsem primerom, ki spadajo v mlajšo starostno kategorijo, napove pozitiven razred. Ker je osnovna stopnja dejanskih povratnikov enaka, večje število pozitivnih napovedi neizogibno privede do večjega FPR za skupino A. Na drugi strani model starejši skupini B v primerjavi s skupino A pogosteje napove nepovratništvo, s čimer pogosteje spregleda dejanske povratnike, kar pomeni višji FNR.

V študijah s področja pristranskosti se takšna neizogibna asimetrija pogosto interpretira kot pristranskost modela, opisani sintetični primer pa kaže, da je vzorec napak neizogibna posledica porazdelitve učnih podatkov.

Tabela 1: Mere uspešnosti, poročane na splošno za vse primere in posebej za obe skupini

	splošno	A	B
točnost [%]	62,5	63,3	61,7
FPR [%]	37,5	45	30
FNR [%]	37,5	28,3	46,7

3 Eksperimenti s podatkovno zbirko ProPublica

Da bi ugotovitev preverili v praksi, smo na podatkovni zbirki *compas-scores-two-years*, ki so jo v svoji izvorni študiji uporabili Angwin idr. [1], izvedli serijo eksperimentov. Podatkovna zbirka vsebuje 7214 primerov iz okrožja Broward v Floridi in 53 atributov. Ker se ukvarjamo s skupinama temnopolnih in belcev, so iz analize izključeni pripadniki drugih

Tabela 2: Distribucija primerov (skupine A in B) glede na dva atributa (število predhodnih kaznivih dejanj in starostna kategorija)

		starostna skupina									
		mlajši			srednji			starejši			Σ
število predhodnih kaznivih dejanj	0-1	130 +	90 +	+	150 +	130 +	-	20 +	80 +	-	600
		70 -	10 -		150 -	170 -		80 -	120 -		600
	2+	130 +	80 +	+	170 +	150 +	+	0 +	70 +	-	600
		70 -	20 -		130 -	150 -		100 -	130 -		600
Σ		400	200		600	600		200	400		

etničnih skupin (ostane 5278 primerov). Za učenje so bili uporabljeni atributi *age* (starost v letih), *age_cat* (kategorični atribut) in *priors_count* (število predhodnih kaznivih dejanj). Ciljna spremenljivka je *two_years_recid* (binarna: povratništvo oziroma nepovratništvo).

V teh podatkih so temnopolti obtoženci v povprečju mlajši (32 let) od belcev (38 let) in imajo več predhodnih dejanj (4,2 v primerjavi z 2,3). Zanimalo nas je, kako na FNR in FPR vpliva spreminjanje te demografske strukture.

Eksperimentalni postopek je zasnovan na metodologiji preteklih raziskav [8][11], kjer so bili za napovedovanje povratništva uporabljeni enostavnejši modeli (logistična regresija). Za filtriranje podatkov in učenje smo uporabili odprtokodno orodje *Orange Data Mining* (<https://orangedatamining.com>). Uporabljen je bil postopek naključnega vzorčenja, kjer je bilo 80 % podatkov namenjenih učenju, 20 % pa testiranju. Skozi 100 ponovitev je bilo izračunano povprečje točnosti, FNR in FPR za vse primere ter posebej za temnopolte in belce (Tabela 3).

Eksperiment 1: Naključno smo odstranili polovico vseh temnopolnih posameznikov. Rezultati so ostali praktično enaki izvorni študiji ProPublice, kar kaže, da v tem primeru sama velikost skupine ni pglavitni vzrok za asimetrijo napak.

Eksperiment 2: Iz podatkov smo naključno odstranili zgolj polovico temnopolnih povratnikov, s čimer smo umetno znižali osnovno stopnjo povratništva temnopolnih. Kljub temu se vzorec napak ni spremenil. Čeprav smo zmanjšali število dejanskih povratnikov, so preostali temnopolti v vzorcu ohranili tvegane attribute (nižja starost, več predhodnih kaznivih dejanj). Ob manjšem številu dejanskih povratnikov se je število napačno pozitivnih primerov (FP) celo nekoliko povečalo.

Eksperiment 3: Obdržali smo vse belce, pri temnopolnih pa smo odstranili izrazito tvegane posameznike in obdržali starejše od 20 let, ki imajo manj kot 3 predhodna dejanja. S tem smo FNR med skupinama praktično izenačili, razliko v FPR pa drastično zmanjšali.

Eksperiment 4: Demografsko sliko smo popolnoma obrnili. Ustvarili smo situacijo, kjer belci predstavljajo skupino z visokim tveganjem za povratništvo (obdržali smo samo mlajše od 40 let), temnopolti pa skupino z nizkim tveganjem (obdržali smo starejše od 25 let z manj kot 3 predhodnimi dejanji). Rezultat je popoln obrat trenda, kjer se model glede na kriterij FPR in FNR sedaj zdi pristranski do belcev.

Tabela 1: Mere uspešnosti za štiri eksperimente

Eksperiment 1			
	splošno [%]	temnopolti [%]	belci [%]
točnost	66,8 ± 1,2	66,4 ± 1,5	67,1 ± 1,4
FPR	32,8 ± 1,8	46,5 ± 2,1	24,7 ± 1,6
FNR	33,8 ± 1,7	21,9 ± 1,5	45,8 ± 2,2
Eksperiment 2			
	splošno [%]	temnopolti [%]	belci [%]
točnost	65,6 ± 1,3	63,7 ± 1,6	67,5 ± 1,3
FPR	34,2 ± 1,9	43,4 ± 2	23,2 ± 1,5
FNR	35 ± 1,8	23 ± 1,4	46,9 ± 2,3
Eksperiment 3			
	splošno [%]	temnopolti [%]	belci [%]
točnost	61,8 ± 1,4	59,1 ± 1,8	63,8 ± 1,5
FPR	41,7 ± 2	46,4 ± 2,2	38 ± 1,8
FNR	32,7 ± 1,6	31,7 ± 1,7	33,4 ± 1,9
Eksperiment 4			
	splošno [%]	temnopolti [%]	belci [%]
točnost	64,8 ± 1,5	67,9 ± 1,9	62,4 ± 1,6
FPR	28,5 ± 1,6	14,9 ± 1,2	41,6 ± 2,1
FNR	46 ± 2,2	73,8 ± 3,1	32,6 ± 1,8

Eksperimenti kažejo, da je zloglasna asimetrija v napakah zgolj refleksija asimetrične strukture v izvornih podatkih.

4 Analiza primernosti kriterijev FPR in FNR

Ugotovitvi, da je asimetrija v merah FNR in FPR povezana s porazdelitvijo podatkov, sledi vprašanje, če je sploh realistično pričakovati, da bosta meri v praksi kdaj izenačeni. To smo raziskali z eksperimentom, pri katerem smo sistematično generirali vse primerne porazdelitve primerov za dve skupini.

Vse generirane porazdelitve so bile uravnotežene tako, da je bilo v vsaki skupini enako število primerov in enako število pozitivnih in negativnih izidov. Ustvarili smo domeno z enim binarnim atributom (*age* z možnima vrednostima *younger* in *older*), pri čemer je veljalo pravilo, da je, če je oseba mlajša, napoved pozitivna. To ustreza običajnemu klasifikacijskemu pravilu v domeni COMPAS-a.

Rezultati kažejo, da je idealna nepristranskost (kjer sta FPR in FNR med skupinama povsem enaka) praktično neobstoječa. Tudi v primeru, ko smo kriterij pravičnosti zrahljali in določili »dovolj nepristransko« porazdelitev (kjer vsota vseh

napak v obeh skupinah ne preseže 20 %). Pri majhnem vzorcu ($N = 10$ primerov, 5 v vsaki skupini) obstaja 76 možnih uravnoteženih porazdelitev. Izmed njih so zrahljanemu pogoju zadostne nepristranskosti ustrezale zgolj 4 porazdelitve (5,3 %). Z večanjem števila primerov ta delež hitro pada (Tabela 4).

V realnih podatkovnih zbirkah (kot je zbirka ProPublice), kjer imamo opravka z na tisoče primeri, je verjetnost, da bi naravna porazdelitev ustrezala kriterijem izenačenih mer, praktično enaka nič. To nakazuje, da kriterij pravičnosti, izražen z merami FNR in FPR, verjetno ni realen za praktično uporabo.

Tabela 4: Prikaz števila vseh uravnoteženih porazdelitev in deleža »dovolj pravičnih« porazdelitev glede na skupno število primerov (N)

Skupno št. primerov (N)	Št. vseh porazdelitev	Št. »dovolj pravičnih« in odstotek od vseh
10	76	4 (5,3 %)
20	1.479	29 (1,96 %)
30	8.604	78 (0,91 %)
40	32.777	169 (0,52 %)
50	91.888	338 (0,37 %)
60	219.200	611 (0,28 %)

5 Zaključek

Pristranskost v strojnem učenju ostaja močno polemična tema, predvsem zaradi pomanjkanja univerzalnih definicij in uporabe medsebojno nezdržljivih kriterijev pravičnosti. Naš prispevek združuje sintetične primere, empirično spreminjanje realnih podatkov ProPublice in matematični argument, ki skupaj nakazujejo, da asimetrija v merah FPR in FNR sama po sebi ni zadosten indikator pristranskosti modelov strojnega učenja, in da jo je treba interpretirati v kontekstu osnovnih stopenj in porazdelitve podatkov.

Razlike, ki so sprožile razpravo o COMPAS-u, so v resnici neizogibna matematična posledica različnih osnovnih stopenj in asimetrične porazdelitve pomembnih atributov (kot sta starost in kriminalna preteklost) v izvorni populaciji. Naši rezultati nakazujejo, da je slepo zanašanje na kriterij izenačenih možnosti za ocenjevanje pravičnosti modelov v praksi nerealistično in potencialno zavajajoče. Prihodnje študije se morajo zato odmakniti od naivnega iskanja izenačenosti teh specifičnih mer ter se posvetiti transparentnosti uporabljenih atributov in globljemu razumevanju mehanizmov strojnega učenja ob soočanju z realnimi, naravno neuravnoteženimi podatki.

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Umetna inteligenca korenito posega v izobraževanje in znanost – kako naprej?

Artificial Intelligence is Radically Transforming Education and Science – What Next?

Maša Poljšak Kus
Centre for Cognitive Science
Faculty of Education
University of Ljubljana
masa.poljsakkus@pef.uni-lj.si

Ivan Bratko
Faculty of Computer and
Information Science
University of Ljubljana
bratko@fri.uni-lj.si

Povzetek

V članku problematiziramo uporabo orodij generativne umetne inteligence (Gen-UI) v akademskem okolju in opišemo nekaj vplivov uporabe Gen-UI na kognitivne procese. Izpostavimo nekaj prednosti in nevarnosti uporabe Gen-UI pri akademskem delu, ki ga v nadaljevanju razdelimo na pedagoški in raziskovalni vidik. Ponudimo tudi nekaj konkretnih predlogov predajanja in preverjanja znanja brez uporabe Gen-UI in pozovemo akademsko sfero k premisleku ciljev izobraževanja, kot so sposobnost izražanja, kritičnega razmišljanja in raziskovanja. Pri tem pa odpiramo vprašanje, ali je ustaljena praksa zaključnih del v dobi Gen-UI sploh še verodostojen izkaz pridobljenega znanja?

Ključne besede

Generativna umetna inteligenca, izobraževanje, znanost, učenje, kognicija.

Abstract

In this paper we critically examine the use of generative artificial intelligence (Gen-AI) in an academic setting and outline some of the observed effects of Gen-AI usage on cognitive processes. We showcase some of the benefits and some of the dangers of using Gen-AI for academic work, which we later discuss from pedagogical and research aspect. We offer some concrete proposals for pedagogical work, such as transferring and testing knowledge without the use of Gen-AI. We appeal to the academic circles to reflect on the goals of education, such as the capability to express oneself, to think critically and conduct research. This invites us to reconsider whether final theses still provide valid evidence of knowledge in the age of Gen-AI.

Keywords

Generative Artificial Intelligence, Education, Science, Learning, Cognition.

1 Uvod

Pojav generativne umetne inteligence (Gen-UI) postavlja pod vprašaj splošno uporabljene in ustaljene principe izobraževanja in znanstvenega dela. Zato morata izobraževalna in znanstvena sfera poiskati odgovore na vrsto zapletenih vprašanj, kot so vprašanja o ciljih izobraževanja, preverjanju znanja, kriterijih strokovne usposobljenosti in avtorstvu raziskovalnih dognanj. Nekateri odgovori so daljnosežne, strateške narave, nekateri pa zahtevajo zelo natančne in konkretne odločitve, ki bodo uveljavljene v novih pravilnikih in operativnih kriterijih za vrednotenje znanja. V tem članku se sprašujemo, kako uporaba orodij Gen-UI vpliva na našo kognicijo, pedagoški proces in raziskovalne prakse. V poskusu odgovora na podobna vprašanja je Univerza v Ljubljani letos izdala monografijo *Generativna umetna inteligenca v izobraževanju* [1], v kateri se avtorji ukvarjajo z različnimi vidiki učenja v digitalni dobi in poudarjajo, da je učinkovita raba Gen-UI v izobraževanju predvsem pedagoško, in ne tehnično, vprašanje. Pri tem mora učitelj ostati osrednji nosilec učnega procesa, Gen-UI pa lahko deluje kot podpora, ne kot nadomestilo.

Glavni cilj tega članka je utemeljiti, zakaj se je nujno in vredno spraševati o uporabi Gen-UI v akademskem okolju. Želimo pokazati, da moramo za ohranjanje akademske in znanstvene integritete več pozornosti nameniti raziskovanju uporabe Gen-UI tudi v sodelovanju z mlajšimi generacijami. Le tako bomo lahko trajnostno in informirano prepletli človeški način učenja z uporabo orodij umetne inteligence. Spoj digitalnih orodij in izobraževanja je bržkone neizogiben, pravzaprav že živeč, ni pa še splošnega konsenza glede vplivov na učenje in druge kognitivne procese. Vsi, ki delujemo v okvirih izobraževalnih institucij, smo se dolžni spraševati o tem, kakšno znanje želimo študentom predati, kako bomo to storili in kako bomo veljavno preverili, ali so študenti začetno znanje dejansko prejeli in razvili sposobnost, da z njim rešujejo probleme tako samostojno kot s pomočjo Gen-UI. V članku spodbujamo k snovanju pedagoškega procesa tudi brez uporabe Gen-UI. Zdi se nam pomembno, da študente urimo tako v samostojnem izražanju in reševanju problemov, kot tudi v zastavljanju kritičnih vprašanj, kar ne krepí le znanja posameznika, pač pa tudi večino uporabnika orodij Gen-UI.

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2 Vpliv uporabe Gen-UI na kognitivne procese

ChatGPT, eden najbolj razširjenih modelov Gen-UI, je v splošno uporabo prišel konec leta 2022, kar je sprožilo vrsto vprašanj tako v akademskih krogih kot med širšo javnostjo, ki vse pogostejše uporablja Gen-UI v vsakdanjem življenju. Pri mladostnikih je uporaba še večja. Anketa [2] opravljena na 495 francoskih udeležencih v starosti od 18 do 25 let pravi, da kar 42% vprašanih uporablja Gen-UI na dnevni bazi. Na univerzah to zajema študentsko populacijo diplomskih in magistrskih študijev, ki obenem predstavlja večino celotne študentske populacije. Druge študije ocenjujejo, da gen-UI uporablja med 40 in 80% mladih, odvisno od načina uporabe in okolja. Zatorej je raziskovanje vplivov uporabe Gen-UI na kognitivne procese uporabnikov te starostne skupine pomembno tudi za prilagajanje pedagoškega procesa v univerzitetnem okolju. Pri tem se je dobro vprašati tudi, kaj izobraževalnim institucijam pomeni znanje, kako ga predati in kako ga preveriti. Najprej pa si na kratko pogledimo, kaj zaenkrat kažejo raziskave o vplivu Gen-UI na kognitivne procese, potrebne za pridobivanje in ohranjanje znanja.

2.1 Učenje in znanje

Če je naš cilj hitreje preteči določeno razdaljo, nam bo to uspelo le, če dejansko tečemo in treniramo na način, ki nam je v izziv in ki od nas zahteva dovolj truda. Največ bomo napredovali, če bo trud pri vrhni meji naših sposobnosti. Če bomo venomer tekli zgolj v coni udobja, te cone ne bomo kaj hitro zapustili. Podobno velja tudi za učenje: če bodo naloge za nas lahke in brez izziva, se iz opravljene naloge ne bomo kaj dosti naučili. Še manj pa, če nam nalogo naredi nekdo drug, tudi če proces nadziramo. Zato je naloge, katerih namen je pridobivanje znanja, smotrno načrtovati tako, da ključno delo opravi učenec in ne Gen-UI.

Brcic in Frlic [3] pravita, da se mora dandanes sleherni učitelj vprašati, kaj naj stori z Gen-UI pri svojem predmetu. Pravita, da pri tem vprašanje ne sme biti *Ali bomo Gen-UI dovolili?*, pač pa *Kako bomo Gen-UI umestili v proces učenja?* Kot ključno problematiko izpostavita, da Gen-UI odstrani, ali vsaj zmanjša, *produktivni trud*, ki pa je za trajno učenje nujen. Učenje ob močni podpori Gen-UI tako ustvari le iluzijo učenja; izdelek je videti bolje, a ker je naloga lažja, pri učencih globinskega razumevanja ni, niti ni spretnosti reševanja. Podobno kaže tudi raziskava Fan idr. [4] s 117 študenti, v kateri so analizirali podatke o njihovem načinu učenja, izkazanem znanju in notranji motivaciji. Študenti, ki so pri pisanju esejev uporabili Chat-GPT, so za izdelek prejeli višje ocene, vendar niso izkazali boljšega znanja od tistih, ki so si pri pisanju esejev pomagali na druge načine (posvet s strokovnjakom, uporaba osnovnih pravopisnih orodij). Bistvenih razlik v motivaciji med skupinami ni bilo. Tudi sicer ni znanstvenega konsenza, ali uporaba Gen-UI vpliva na motivacijo pozitivno ali negativno. Fan idr. [4] so sicer notranjo motivacijo opredelili prek štirih dimenzij: zanimanje/zabavljanje, ocena lastne sposobnosti, trud/pomembnost in pritisk/napetost. Čeprav niso odkrili razlik v motivaciji, pa so opazili, da so študenti v Chat-GPT skupini uporabljali drugačne načine samo-nadzorovanega učenja (SNU). SNU so opredelili skladno z Zimmermanovo [6] definicijo samo-nadzora, ki zajema tri ciklične faze: vnaprejšnji premislek (*»forethought«*) → izvedba / voljna kontrola → samo-refleksija. Chat-GPT skupina je procese samo-nadzora pogosto prelagala na Chat-GPT, napram

drugim skupinam pa je izkazala manj samo-nadzornih procesov sploh (npr. manj samo-ocenjevanja in samo-usmerjanja). Samo-nadzorni procesi so se torej v primeru uporabe Gen-UI preusmerili od notranjega nadzora k zunanji regulaciji prek orodja Gen-UI, kar pa lahko vodi v *kognitivno lenobo*. Več o tem v naslednjem poglavju.

Tudi raziskava Bastanija idr. [6] s skoraj tisoč turškimi gimnazijci tekom enega semestra pri predmetu matematike kaže, da neomejen dostop do Gen-UI takojšnjo uspešnost pri reševanju nalog sicer izboljša (+ 48%) napram kontrolni skupini, ki ni uporabljala digitalnih tehnologij. Na dolgi rok in pri preverjanju znanja, kjer Gen-UI ni dovoljena, pa je rezultat napram kontrolni skupini pričakovano slabši (-17%). Avtorji ponudijo razlago, da neomejena in nekontrolirana uporaba Gen-UI služi kot potuha, pri čemer učenec nima potrebe, da bi delal na lastni spretnosti in delo raje preloži na Gen-UI. Ma in Zhong [7] pa v obsežni meta-analizi prideta do nasprotnih zaključkov, in sicer da so prav na področju matematike najbolj opazni pozitivni vplivi uporabe Gen-UI, ki so sicer opazni tudi na drugih področjih. Opozarjata pa, da je za uspešno integracijo Gen-UI v pedagoški proces ključno, da se uporablja področju prilagojeno Gen-UI in da se ob uporabi UI posveča pozornost tudi klasičnim učnim metodam brez vsakršne uporabe Gen-UI.

Pri vsem tem se odpira vprašanje merjenja znanja, zlasti če uporaba Gen-UI orodij res prinaša boljše ocenjene pisne izdelke, ki pa ne odsevajo znanja študenta brez uporabe Gen-UI. Rudolf idr. [8] se sprašujejo, ali razširjena uporaba Gen-UI pomeni konec uveljavljenega ocenjevanja v univerzitetnem okolju. Zlasti jih zanima, ali pisni (elektronski) izdelki sploh še odražajo dejansko znanje študenta in pozivajo izobraževalne institucije k premisleku svojih ocenjevalnih praks. Tu velja izpostaviti, da so zaradi razširjene uporabe elektronskih naprav in posledično pisanja na način tipkanja mlajše generacije vse manj večje pisanja z roko in pisalom [9], kar študentom otežuje pisne izpite in lahko vpliva na izkazano znanje.

2.2 Meta-kognicija in kritično razmišljanje

Komplement prej omenjenemu procesu samo-nadzora je meta-kognicija. Termin je vpeljal John Flavell [10] in v splošnem pomeni *razmišljanje o razmišljanju* ali *kognicijo o kogniciji*. V kontekstu interakcije človek-UI opredeljujemo meta-kognitivno lenobo kot *uporabnikovo odvisnost od UI-podpore, prelaganje meta-kognitivnega dela in manj učinkovito povezovanje nalogi primernih meta-kognitivnih procesov* (npr. presojanje o tem, ali imamo potrebno znanje in kako ga pridobiti, če ga nimamo). Že prej smo opozorili na možnost kognitivne lenobe, s čimer se skladajo tudi ugotovitve raziskav Fernandes idr. [11]. Te kažejo, da so sodelujoči, ki so pri reševanju logičnih problemov uporabili Gen-UI, probleme sicer rešili nekoliko bolje kot kontrolna skupina, še bolj izrazito pa so precenili svojo uspešnost reševanja. Višje kot so imeli tehnično znanje za uporabo Gen-UI, bolj so samozavestno, vendar manj natančno, ocenili svoje rezultate (ki so bili sicer produkt sodelovanja z Gen-UI). Li idr. [12] v sistematičnem pregledu 67 študij na področju študentske uporabe Gen-UI v univerzitetnem okolju ugotovijo, da nenadzirana uporaba vodi v upad kritičnega in kreativnega razmišljanja, pogosto v povezavi s *kognitivnim prelaganjem* (*»cognitive offloading«*). Po drugi strani pa primeri, kjer je bila Gen-UI nadzorovano in prilagojeno vključena v proces učenja, kažejo na podporne in pozitivne učinke. Na tej podlagi ponovno

poudarjamo potrebo po premisleku in prilagoditvi učnega procesa na način, ki vključuje nadzirano rabo Gen-UI. Fan idr. [4] so pokazali, da prelaganje kognitivnih procesov na Gen-UI vodi v siromašnejše izvajanje samo-nadzornih procesov, rezultate [11] pa lahko interpretiramo, da bolj, ko smo večji Gen-UI, bolj zaupamo njenim rešitvam, vse manj pa se zanašamo na našo lastno kritično evalvacijo. Bolj, ko se za odločanje in presojanje naslanjamo na Gen-UI, manj krepimo lastno meta-kognitivno zmožnost.

Shaw in Nave [13] celo pravita, da moramo začeti razmišljati o tri-sistemski teoriji kognicije: sistem 1 je hitri, intuitivni sistem, sistem 2 je počasnejši, premišljeni sistem, novi sistem 3 pa je sistem umetne inteligence. Sistema 1 in 2 delujeta na osnovi človeške (utelešene) kognicije, sistem 3 pa na osnovi Gen-UI, ki lahko tako dopolnjuje kot nadomešča interne procese (sicer pripisane kognitivnemu sistemu 2) kot je meta-kognicija. Prepoznala sta, da udeleženci, ki redno uporabljajo Gen-UI, kažejo znake *kognitivne predaje* (»cognitive surrender«). To pomeni, da so prevzeli rezultate Gen-UI z minimalno presojo, pri čemer so zaobšli tako sistem 1 (intuicijo) kot sistem 2 (premislek). To je veljalo zlasti za manj motivirane udeležence, ki so Gen-UI bolj zaupali. S tem je povezan tudi fenomen *kognitivnega prelaganja* in posledično *kognitivnega dolga*, ki zajema prelaganje kognitivnih procesov na nekoga drugega, v našem primeru na Gen-UI. Gerlich [14] opazi tovrstno povečano kognitivno prelaganje zlasti pri mlajših uporabnikih, ki izkazujejo tudi nižje ravni *kritičnega razmišljanja*. Slednje opredeli kot zmožnost analiziranja, vrednotenja in povezovanja informacij v kontekstu sprejemanja (razumskih) odločitev. Torej nekaj, kar bi po Kahnemanu [15] upravljal sistem 2, sedaj vse pogostejše prevzema sistem 3. Tu se poraja vprašanje, ali velja novemu tretjemu sistemu navkljub še vedno krepiti in negovati sistema 1 in 2.

2.3 Kreativnost in občutek avtorstva

Sama uporaba Gen-UI še ne zmanjša kreativnosti in inovativnosti avtorja, če ta Gen-UI uporabi kritično in selektivno. To stališče zagovarjajo tudi Nakazawa idr. [16] v primerih, ko Gen-UI ostaja v vlogi orodja ali pomočnika, ne glavnega avtorja. Kot orodje lahko avtorju celo bistveno pripomore pri elokventnem in efektivnem izražanju avtorskih idej. Anderson idr. [17] so opazili, da uporaba orodja ChatGPT sicer poveča količino podrobno opredeljenih idej, vendar so se uporabniki za te ideje počutili manj odgovorni. Ideje različnih uporabnikov so bile tudi bolj semantično podobne v primerih, ko so uporabili Gen-UI napram primerom, ko so kreativne naloge reševali samostojno. To pomeni, da so si bile ideje udeležencev, ki so uporabljali enako orodje, po vsebini in načinu reševanja blizu. To poimenujejo *efekt homogenizacije*. Homogenizacijo prepoznajo tudi Zhou idr. [18], ki so v svoji študiji zabeležili kratkoročno porast v kreativnosti ob delu z orodji Gen-UI. Ko pa so udeležencem orodja odvzeli, je kreativnost upadla, homogenizacija pa je ostala. To odpira vprašanje integralnega dela reševanja problemov: inovativnosti in ustvarjalnosti.

Z ustvarjanjem je povezan tudi *občutek avtorstva*. Ta se navezuje na raziskovalno integriteto (da smo pripravljene svoje ime zastaviti za vsebino, ki jo sporočamo) in izjavljeno avtorstvo (koga smo navedli kot avtorja). Zajema pa tudi občutek lastništva [19], ko nek objekt dojemamo kot nam lasten (pri čemer ni

relevantno, ali nam ta objekt pravno pripada). V razmerju med uporabnikom in Gen-UI je sicer občutek avtorstva uporabnika odvisen od uporabnikovega (občutka) doprinosa. Več kot so uporabniki prispevali h končnemu izdelku, močnejši je občutek avtorstva (kar bržkone velja za vsako skupinsko delo).

Na kratko omenjamo tudi medijsko odmevno raziskavo z Univerze MIT [20], ki je sicer še v postopku recenzije. V raziskavi so udeleženci v treh sejah pisali eseje v treh skupinah: z uporabo Gen-UI, z uporabo spletnih iskalnikov in brez orodij. Na četrti seji so pri prvi in tretji skupini zamenjali pogoj orodja. Pri tistih, ki so prve tri seje uporabljali Gen-UI za pisanje esejev, so si bili eseji tudi po četrti seji, ko niso uporabljali nobenega orodja, med seboj bolj podobni kot pri tistih, ki orodij večinoma (razen na četrti seji) niso uporabljali. Avtorji esejev, napisanih s pomočjo Gen-UI, so poročali o najnižji stopnji občutka avtorstva, avtorji esejev, ki niso uporabljali nobenih orodij, pa najvišjo. Udeleženci, ki so tri seje pisali brez orodij, v četrti seji pa z Gen-UI, so znali jezikovnim modelom zastavljati premišljena vprašanja, povezljivost možganskih regij (merjena z elektroencefalografom, EEG) pa je celo narasla. To nakazuje, da je način, namen in vrstni red uporabe Gen-UI ključen tako za kvaliteto končnega izdelka kot večino in končen doprinos človeškega avtorja.

3 Kako naprej?

3.1 Pedagoški vidik

Zaenkrat v javnosti velja strinjanje, da Gen-UI sicer prinaša velike spremembe, marsikatero pozitivne, vendar da moramo biti pozorni, da ne spodnese temeljnega namena izobraževanja: učence naučiti razmišljati in povezovati ter jim predati dovolj znanja, da lahko oboje počnejo dobro [21]. Tudi če verjamemo (ali pa morda prav zato, ker verjamemo), da Gen-UI prinaša napredek in nadgradnjo človekovih zmožnosti spoznanja in ustvarjanja, moramo učence učiti razmisleka in izražanja znanja tudi brez opore na Gen-UI. Če želimo preveriti, kakšno je njihovo znanje brez uporabe Gen-UI, je smiselno, da načrtujemo preverjanja znanja brez digitalnih vmesnikov. To zajema pisanje z roko na papir in ustni zagovor, k čemur se vrača vse več učiteljev [22]. Vendar takšno preverjanje znanja nima pravega smisla, če učencev ne urimo v analogni eksplikaciji naučenega. Če študenti večino zapiskov natipkajo na računalnik, podatki pa kažejo [9], da tudi zasebno vse manj vadijo svoj rokopis, bodo pisni izpiti že samo zaradi načina izražanja znanja za študenta težji in bolj stresni – kar lahko vpliva na kvaliteto izkazanega znanja. Kot je nakazala Hartmann [22], so lahko ustni zagovori uspešen način preverjanja znanja v dobi Gen-UI, zlasti, če študente predhodno ustrezno opremimo za tovrstno izražanje znanja. To ima lahko pozitivne posledice tudi za splošno veščino sporazumevanja, ki v dobi socialnih omrežij počasi hlapi, pa vendar ostaja ključno družbeno lepilo. V kontekstu uporabe Gen-UI je prav tako smiselno, če znajo njeni uporabniki samostojno ubesediti probleme, s katerimi se soočajo in zastaviti problemom ustrezna vprašanja. Oboje prispeva k boljšim odgovorom Gen-UI, vendar da to lahko presodimo, ne smemo biti meta-kognitivno leni, pač pa aktivni in samostojni razmišljevalci. Ali bodo mladi uporabljali Gen-UI ali ne, ni več smiselno debatirati. Pač pa je treba razpravljati o tem, kako bomo zagotovili, da naši

študenti uporabljajo Gen-UI na konstruktiven način. Pri tem je naša dolžnost, da jih usmerjamo in po potrebi tudi omejimo uporabo Gen-UI, v kolikor presodimo, da uporaba Gen-UI za reševanje ni ne potrebna ne zaželeno.

Ne pozivamo pa le k splošnem razmisleku, temveč odpiramo tudi nekaj konkretnih vprašanj. Kaj so cilji izobraževanja, ali so se ti spremenili pod vplivom GenUI? In ali so med njimi še vedno: sposobnost izražanja in pisanja, sposobnost predstavljanja (npr. svojega dela), sposobnost samostojnega (kreativnega, kritičnega) razmišljanja in sposobnost raziskovanja? Kako naj v bodoče poteka preverjanje znanja, če vemo, da lahko pisne izdelke v digitalni obliki zlahka ustvari Gen-UI? »Digitalni« izpiti najbrž niso več smiselni, ali to pomeni, da bodo pisni izpiti izvedeni striktno brez uporabe digitalnih naprav? Kako je z ustnimi izpiti, ki pa zahtevajo mnogo več časa na strani učiteljev? Ali je avtomatsko ocenjevanje študentovih izdelkov z orodji Gen-UI sprejemljivo? In nenazadnje, ali je še smotrno izdelovati eseje, seminarske, diplomske, magistrske in doktorske naloge? Takšni projekti, namreč ne dokazujejo več študentove usposobljenosti.

3.2 Raziskovalni vidik

Za oris vpliva Gen-UI na raziskovanje bomo nastavili kratek miselni eksperiment, tekom katerega je potrebno opraviti kompleksno kvalitativno analizo velike količine besedilnih podatkov. Te analize se bomo lotili z dvema ekipama. Prva ekipa zajema kvalitativne znanstvenike, ki bodo Gen-UI sicer uporabljali, a v minimalnem obsegu. Druga ekipa zajema predvsem agente Gen-UI, ki pa jih upravlja in usmerja znanstvenik. Vsaka ekipa ima svoje prednosti in omejitve. Pri obsežni količini podatkov, ima Gen-UI prednost, saj lahko hitreje in natančneje pregleda celoto besedila. Pri določanju tega, kaj je za raziskavo *bistveno*, kakšna je *usmeritev* raziskovanja in *presojo* predlaganih kategorij, pa je ključen in odgovoren znanstvenik sam, ki bo ob predstavitvi rezultatov tudi zastavil svoje ime in *raziskovalno integriteto*. Če ekipi med seboj sodelujeta in se preverjata, si lahko zamislimo, da bomo prišli do kvalitetnih rezultatov.

Da pa lahko o čem takem postavljamo znanstvene trditve, moramo primerjati rezultate dejanskih raziskovalnih skupin: tako z Gen-UI kot brez. Potrebujemo kvalitetno empirično gradivo, da lahko informirano presojamo o tem, kdaj je uporaba Gen-UI priporočljiva, kdaj odvečna in kakšno vlogo naj v razmerju z raziskovalci zavzame. Potrebujemo tudi podatke tako o kvantiteti kot kvaliteti člankov, objavljenih po letu 2022, da lahko začnemo soditi o tem, kam in na kakšen način Gen-UI pelje znanstveno dejavnost. Le na ta način lahko oblikujemo raziskovalne smernice, ki informirano stopajo v korak s časom.

4 Poziv k premisleku in zaključek

Vsakodnevno poslušamo ugotovitve kot so: »UI nam pomaga, da smo povsod bolj učinkoviti, v zdravstvu, šolstvu, znanosti, sodstvu« in »toda UI je le orodje, ki ne more nadomestiti zdravnika, učitelja, sodnika.« Vendar primeri iz prakse nakazujejo na drugačen zaključek [23]: da UI *de facto* prevzema vodilno vlogo, vloga človeka pa je zreducirana na formalno potrjevanje odločitev UI. Pri tem je tipično človek-potrjevalec preobremenjen, stalno mu primanjkuje časa, znanja in

informacij, zato se zlahka sprijazni s tem, da »UI tako ali tako sama vse opravi boljše«.

Gen-UI nikakor ni prva tehnologija, ki je pripeljala do zagate, kako novo orodje združiti z že obstoječim naborom tehnologij. Navsezadnje se je že Sokrat [24] spraševal o posledicah, ki jih bo širša uporaba pisave prinesla v svet. Sam je zagovarjal stališče, da bomo zaradi pisave imeli slabši spomin, saj se bomo nanj manj zanašali. Tudi kalkulatorji in navigacijski pripomočki so nekatere naloge prej omenjenega »sistema 2« prenesli na pomožno orodje, ki je prešlo v splošno rabo – pa vendar se v šolah še vedno učimo reševanja osnovnih računskih operacij »le z glavo in papirjem«, kot tudi tega, kako brez kompasa najti sever v naravi. Ko govorimo o orodjih umetne inteligence, pa je situacija bistveno drugačna. V prejšnjih primerih je imel človek še vedno veliko problemskega prostora iznad dometa nove tehnologije, v primeru Gen-UI pa se je ta prostor močno skrčil. Morda celo do te mere, da se je bolj primerno vprašati, kakšen prostor nam sploh še ostaja in ne koliko prostora je Gen-UI prevzela.

Če res zmanjkuje problemskega prostora, ki bi nujno zahteval človeško kreativnost, bi lahko izgledalo racionalno, da človek v celoti prepusti reševanje problemov Gen-UI, obdrži pa le bolj ali manj formalno vlogo dokončnega potrjevalca generiranih odločitev; tudi pri daljnosežnih odločitvah, kot sta npr. pisanje zakonov in odločanje v pravosodju. Morda bi na ta način res prihajalo do manj napak kot pri tradicionalnem človeškem odločanju. Vseeno pa ta pot ni videti posebno privlačna, saj bi na ta način Gen-UI lahko postopno vplivala in preoblikovala tudi osnovne človeške vrednote in tako prestopila »rdečo črto«, mejo sprejemljivega. Preoblikoval pa bi se tudi način človeškega razmišljanja, presojanja, učenja in znanja. Zmožnost kritičnega razmisleka je navsezadnje ključna tudi za obstoj demokracije.

Zato pozivamo izobraževalne inštitucije, da premislijo o svojem načinu poučevanja in merjenja znanja, ter svoje učitelje poučujejo o delovanju in dometu Gen-UI, ob tem pa jim ponudijo oprijemljive smernice za načrtovanje pedagoškega procesa. Predlagamo, da se določeno pozornost namenja tudi ohranjanju starejših tehnologij, kot sta branje daljših tekstov (knjig) in samostojno pisanje povezanih besedil, pri slednjem pa tako z uporabo Gen-UI kot brez. Izvajalce pedagoškega procesa spodbujamo, da svoje ure (še naprej) izvajajo na način, ki podpira študentova kognitivna »sistema 1 in 2«, in ki krepi tako študentovo kritično sposobnost kot večščino izražanja. Predlagamo tudi, da se v predavalnicah občasno spodbuja prostor brez tipkovnic, s tem pa goji večščino aktivnega poslušanja in rokopisa. Učne ustanove morajo tehtno premisliti, kakšni bodo v bodoče kriteriji za dokazovanje strokovne usposobljenosti. Doslej so dokazila o končanem študiju na ugledni univerzi veljala kot verodostojno potrdilo strokovnosti, kot tudi objave v priznanih revijah, odmevnost raziskovalnega dela pa je kazalo število citatov. Glede na to, da je mogoče vse naštetu doseči z uporabo orodij Gen-UI, pa so ta merila zdaj vprašljiva. To maje stoletja dolgo tradicijo izobraževanja, kar gotovo pomeni, da lahke rešitve ni. Zato pa je še toliko bolj potrebno, da si drznemo soočiti se s tovrstnimi problemi.

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Reading literacy and technological and engineering literacy in the context of their links to critical thinking

Dejan Zemljak
Faculty of Natural Sciences and
Mathematics
University of Maribor
Maribor, Slovenia
dejan.zemljak1@um.si

Dr. Maja Kerneža
Faculty of Education
University of Maribor
Maribor, Slovenia
maja.kerneza1@um.si

Dr. Urška Martinc
Faculty of Arts, University of
Maribor, Slovenia
Faculty of Education
University of Ljubljana
Ljubljana, Slovenia
urska.martinc1@um.si

Abstract

This paper examines the interdisciplinary issue of the role of various forms of literacy in the development of critical thinking in contemporary primary education. Drawing on findings from cognitive psychology and the didactic sciences, we put forward the thesis that reading, technological and engineering literacy are not merely independent competences, but that their didactic integration can make a significant contribution to fostering critical thinking. Using a narrative literature review across three mutually complementary fields – the didactics of technology, reading literacy and critical thinking – we identify theoretical intersections and conclude that the current didactic separation of these two forms of literacy in school practice diminishes the quality of higher-order cognitive processes in pupils. Technological and engineering literacy provide a contextual framework and a substantive basis for understanding the contemporary technology-mediated world, whilst reading literacy constitutes the fundamental ability to interpret, evaluate and critically reflect upon texts, data and information. We conceptualise critical thinking as a cognitive competence that can be fostered and developed through coherent and high-quality didactic integration of both forms of literacy.

Keywords

reading literacy, technological and engineering literacy, critical thinking, higher-order skills

1 Introduction

1.1 Reading literacy and the development of critical thinking

In the specialist literature, reading literacy is defined as the ability to understand, use, evaluate and reflect on texts, with a view to achieving one's own goals, developing knowledge and

participating in society [25]. Literacy, understood in this way, goes beyond the mere decoding of graphic symbols and encompasses interpretation, evaluation and reflection – processes that are linked to certain important dimensions of critical thinking. The relevance of this conceptualisation is also confirmed by the results of the PISA 2022 survey, which indicate a marked decline in reading achievement **Error! Reference source not found.**, thereby highlighting the need for the systematic development of reading literacy within the school system.

From a cognitive-psychological perspective, reading comprehension is not a linear process of decoding, but rather a constructive activity in which the reader forms a mental representation of the text at multiple levels, ranging from the surface code to the situational model [14]. At the level of the situational model, the reader integrates textual information with prior knowledge and assesses its coherence and reliability, with some processes of reading comprehension being linked to critical thinking. This ability to link textual information with prior knowledge can make the transition from mere reproduction of information to reasoned judgement more difficult [21]. [16] discusses related processes from a text-linguistic perspective within the framework of the seventh component of reading literacy, which defines text comprehension as the recognition of linguistic and non-linguistic elements of context, on the basis of which the reader distinguishes the essential from the non-essential.

Recent empirical studies also suggest a link between reading comprehension and specific aspects of critical thinking, although these were conducted on older populations. Among secondary school pupils, a link was found between deeper reading comprehension and a greater ability to critically evaluate texts [23], whilst among university students, it was found that reading with the aim of critical evaluation is associated with a greater ability to detect inconsistencies [20]. As both studies examine a population older than the target group of this paper, we use their findings as indirect empirical support, rather than as evidence of the relationship among pupils in the second and third three-year cycles of primary school.

In Slovenia, critical reading is classified as one of the nine components of reading literacy [10], specifically the ninth component – critical reading – which [18] define as the ability to assess and evaluate the message, facts and viewpoints in a text, and to form a well-reasoned opinion. In this model, critical reading is treated as an integral part of reading literacy.

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There is a conceptual and functional link between reading literacy and critical thinking, as reading literacy involves the ability to understand, evaluate and reflect on information. [9] defines critical thinking as the purposeful use of cognitive skills in problem-solving and decision-making, whereby the quality of one's understanding of the available information can significantly influence judgement. A superficial understanding of a text can make it difficult for a learner to construct arguments and identify logical inconsistencies, thereby reducing the quality of their reasoned judgement. Reading literacy can therefore significantly support the understanding of problem situations presented in text form, as well as the analysis and evaluation of information, including in the fields of technology and engineering.

1.2 Technological and engineering literacy and the development of critical thinking

Technological and engineering literacy is one of the fundamental, yet conceptually more challenging, concepts in modern technical education. Its complexity stems from the fact that it encompasses a broad and constantly evolving field of human activity, which is closely intertwined with the natural sciences, mathematics and other disciplines [27]. In this context, the concept of literacy does not merely refer to the functional ability to handle technological tools, but to a deeper cognitive understanding of technology as a phenomenon, a process and a system [12]. For brevity, the term 'technological literacy' is used interchangeably with 'technological and engineering literacy' throughout this paper.

The most important international reference framework in this field is the Standards for Technological and Engineering Literacy (STEL), published in 2020 by the International Society for Technology and Engineering Education [13]. The aim of STEL is not to train technologists or engineers, but to broaden the technological and engineering literacy of all learners to such an extent that they are able to make informed decisions regarding the technologies they encounter in the world. In Slovenia, this literacy has long been reduced to the use of information and communication technology (ICT), whilst its deeper significance has remained of peripheral importance [15]. [33] notes that the level of technological literacy among trainee teachers in the Slovenian higher education sector is unsatisfactory, which indirectly affects the quality of teaching technical subjects in primary schools.

In the Slovenian primary school curriculum, the subject of 'Technology' plays a central role in the development of this literacy. The new curriculum [24] directly links it to the development of technical thinking, creativity and innovation, and emphasises that the subject is one of the few that enables the implementation of higher cognitive levels of knowledge according to Bloom's taxonomy – particularly analysis, synthesis and evaluation. Primary schools play a key role, as they are the only institutions in the education system that offer technical content to the entire pupil population [15].

The relationship between technological and engineering literacy and critical thinking is clearly intertwined: technological literacy significantly supports and enriches the capacity for critical thinking, whilst at the same time it can only develop to a high standard in the presence of critical reflection. A learner who does

not understand how technology works at the level of processes, systems and societal impacts finds it more difficult to analyse and evaluate the technological solutions they encounter in a meaningful way. [29] note that the engineering design process (EDP) acts as a platform for situational learning, in which pupils develop higher-order thinking whilst solving authentic problems. Curriculum reforms in several countries confirm that STEM approaches, particularly through the EDP, enable pupils to develop critical thinking, creativity and communication skills [17]. Technological and engineering literacy can thus significantly support the analysis and evaluation of technological problems and the transition from the reproduction of knowledge to reasoned judgement.

1.3 Critical thinking as a complex, domain-specific competence

It is appropriate to begin by explaining what the concept of critical thinking means, as critical thinking has been defined differently across various periods and in different fields [11] [3] [4] [19] [8] [7]. In what follows, we shall attempt to answer the question: To what extent is critical thinking linked to subject-specific knowledge, and can it be understood as a general cognitive ability?' It must be emphasised that critical thinking goes beyond the expression of a particular personal belief [11], as it involves specific cognitive abilities (such as judgement, analysis, evaluation and others) that an individual can learn through a specific process [11] [6] [8] [19]. These are specific cognitive abilities and skills, but they are contingent upon the individual's ability to apply them (e.g. a willingness to test one's own views, a willingness to investigate, etc.), whereby, for example, sound reasoning requires knowledge of the subject area in question [11] [3] [4] [22] [19] [8] [32] [31].

The definition of critical thinking has evolved over the years; the American philosopher John Dewey [3], who used the term 'reflective thinking', argued that an individual should not accept beliefs automatically:

active, persistent and careful consideration of any belief or supposed form of knowledge in the light of the grounds that support it, and the further conclusions to which it tends. ([3]: 6; [4]: 9).

Hitchcock emphasises that 'critical thinking //...is a widely accepted educational goal' [11], a view also put forward by other authors, such as Siegel [28], whereby it involves goal-oriented thinking; however, as Hitchcock [11] emphasises, definitions of critical thinking may vary depending on criteria, standards, etc. [11]. When discussing educational objectives, Hitchcock highlights the importance of taking learners' autonomy into account [11]; furthermore, the development of critical thinking also helps learners to succeed in everyday life, meaning they can make independent and considered judgements says Hitchcock [11]. However, as he explains, questions remain regarding how effectively critical thinking can be transferred between different subject areas, how to distinguish critical thinking from other types of thinking, and so on [11]. We also believe that incorporating argumentation and the other elements mentioned by Hitchcock [11] into teaching can help to distinguish more clearly between opinion and critical thinking.

McPeck's view is also particularly relevant to this paper; he argues that critical thinking should not be taught as a separate

subject but should be integrated into school subjects [22] [11]. Our analysis of the authors' works revealed that the importance of subject-specific knowledge and contextual content in critical thinking is underscored by Dewey [3] [4], Weinstein [30], Bailin et al. [1], Willingham [32] [31], Hitchcock [11] and others [11], suggesting that critical thinking can be meaningfully fostered and applied within the context of specific subject areas, in our case, reading literacy and technological and engineering literacy.

At this point, we shall briefly highlight the importance of incorporating critical thinking into the educational process; we shall therefore go on to mention two significant historical milestones which demonstrate that critical thinking is, in fact, of exceptional importance. Among the key milestones in the development of critical thinking, we would highlight the turning point in 1956 when Bloom included higher-order cognitive processes associated with critical thinking – in particular, analysis, synthesis and evaluation [11] [11] – in his 'taxonomy of cognitive educational objectives' [11]. It is also worth noting that as early as 1962, Ennis '*proposed 12 aspects of critical thinking as a basis for research on the teaching and evaluation of critical thinking ability*' (as cited by Hitchcock in [11]). These two contributions had a significant influence on the establishment of critical thinking as an educational objective; however, as Hitchcock [11] argues, critical thinking does not involve drawing conclusions without verifying evidence as well as the other important components of critical thinking identified by the aforementioned authors. [11] [3] [4]. We also agree that critical thinking is linked both to cognitive abilities and dispositions and to knowledge of the field in which an individual is making judgements [11]. In the context of our study, these fields are reading literacy and technological and engineering literacy. As Hitchcock explains, high-quality judgement requires the use of appropriate criteria, reasons and evidence, as well as the ability to analyse and evaluate information. [11]. Hitchcock argues that the educational objective is therefore:

"The real educational goal is recognition, adoption and implementation by students of those criteria and standards¹. That adoption and implementation in turn consists in acquiring the knowledge, abilities and dispositions of a critical thinker." [11]. In this paper we follow this position and treat critical thinking as a general cognitive competence whose meaningful application nonetheless depends on domain-specific knowledge – a distinction we return to in the discussion of reading and technological and engineering literacy below.

2 Interconnections between the areas under consideration

In Slovenian educational practice, technological and engineering literacy is traditionally situated within the subject area of engineering and technology and is often treated separately from linguistic and cognitive competences. Such disciplinary separation may also affect the didactic integration of technical, linguistic and cognitive competences. There is a possibility that the acquisition of technical knowledge is not always systematically linked to the development of the ability to reflect

critically on it, interpret it through reading, and evaluate it in a reasoned manner. As [27] note, one of the key challenges in the field of technology and engineering education remains precisely that of conveying a comprehensive picture of what technological literacy encompasses, as its scope is so broad and constantly evolving that it cannot be treated as a narrow discipline.

In some of the models under consideration, critical thinking is positioned as a component of a particular form of literacy, rather than as a separate, equivalent third competence. The STEL standards [13] place critical thinking within technological literacy itself, whilst the nine building blocks of reading literacy [10] treat critical reading as part of reading literacy. In this paper, we propose a conceptual model in which all three competences are functionally linked within a specific problem-based context, which, to our knowledge, goes beyond existing conceptualisations. It should be emphasised that the choice of precisely these two forms of literacy – reading and technological-engineering – is based on the curricular framework of the subject 'Technology' in Slovenian primary schools and does not imply a claim that these are the only or universally necessary two competences for the development of critical thinking in general.

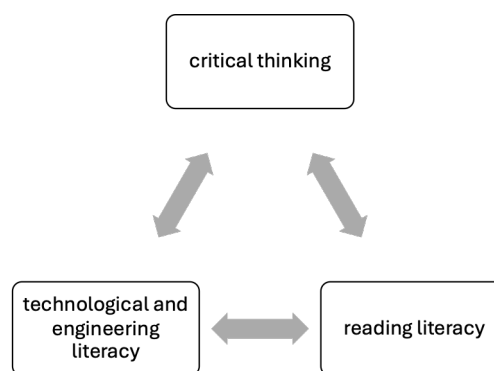


Figure 1: Critical thinking and both forms of literacy are interlinked in the context of solving authentic problems presented through technology and text

The intersection of all three areas under consideration is most clearly evident in situations involving authentic problem-solving, which require pupils to simultaneously decode and interpret instructions or technical documents, an understanding of the technological context and how systems operate, and a critical evaluation of proposed solutions and their consequences. As highlighted in previous chapters, reading literacy enables or facilitates pupils' understanding of the problem context conveyed through text, whilst technological and engineering literacy support the understanding and evaluation of technical information and moving beyond the level of mere knowledge reproduction. In this regard, a distinction must be made between domain-specific critical reading or evaluation, which forms part of the respective literacy itself (e.g. the ninth component of reading literacy), and the more general, transdisciplinary critical thinking, the development and application of which can be supported by their integration within an authentic problem-based

¹ See Hitchcock (2024) for a discussion of the criteria and standards of critical thinking.

context. Without this combination, it is difficult for a learner to move beyond the level of reproduction and reach the level of informed judgement. This functional interdependence is not merely a logical deduction from the previous chapters, but a synthesised thesis that follows from a comparison of the two theoretical frameworks. Whilst underdeveloped reading literacy can limit the processing of technical texts, and limited technological and engineering literacy can hinder the content-based assessment of technological issues, both competences represent important factors that can support the development and application of critical thinking in this specific context. In this sense, the three competences do not operate in parallel, but are functionally interdependent and can complement one another; a more comprehensive development could be supported by cross-curricular didactic approaches. We regard the proposed model as a conceptual starting point for further theoretical discussion and empirical testing.

3 Conclusion

This paper is based on the premise that integrating reading literacy with technological and engineering literacy can support the development and application of critical thinking in solving authentic problems presented through technology and text. A review of the relevant literature from three mutually complementary fields – reading literacy, technological and engineering literacy, and critical thinking, suggests that the current didactic separation of these competences in school practice diminishes the quality of higher-order cognitive processes and limits pupils' ability to engage in autonomous, reasoned and reflective judgement in a technology-mediated world. The proposed interdisciplinary model, which regards reading, technological and engineering literacy as important competences that can support the development of critical thinking in the context under consideration, opens a new conceptual space for understanding the relationships between these competences. This is a theoretical thesis awaiting further conceptual or, potentially, empirical testing, rather than a definitively confirmed finding. A limitation of the theoretical grounding presented here is that direct empirical evidence linking reading comprehension to critical thinking currently derives mainly from secondary and tertiary populations; empirical validation with primary-school pupils remains a task for future research. At the same time, it offers a didactic starting point for designing approaches that transcend traditional subject boundaries and promote the integrative development of all three competences within the framework of primary education. Interdisciplinary integration is not merely a methodological advantage, but a direct reflection of the thesis advocated by this paper: the integration of different perspectives can contribute to a more comprehensive understanding of complex cognitive phenomena.

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MED SRCEM, ČUSTVI IN STARŠEVSKIM ODZIVOM: PSIHOLOGIJSKA REGULACIJA KOT UTELEŠENI KOGNITIVNI PROCES

Izr. prof. dr. Sara Jerebic, spec. zakonske in družinske terapije

Teološka fakulteta

Univerza v Ljubljani

Katedra za zakonsko in družinsko terapijo

ter psihologijo in sociologijo religije

e-mail: sara.jerebic@teof.uni-lj.si

Povzetek¹

Starševski odziv v čustveno zahtevni situaciji ni samo rezultat zavestne presoje, temveč nastaja v prepletu telesne aktivacije, čustev, zaznave in pomena, ki ga starš pripiše otrokovemu vedenju. Prispevek izhaja iz kliničnega konteksta, kjer ugotavljamo, da se starši pogosto vračajo v podobna čustveno-telesna stanja kot so npr. napetost, jeza, sram, nemoč, strah, tudi kadar vedo, da njihov ponavljajoči se odziv odnosu ne koristi. Izraz »zasvojenost s čustvenimi stanji« je zato uporabljen kot klinična metafora, ne kot diagnostični konstrukt. Znanstveno natančnejši okvir ponujajo afektivna inercija (angl. affective inertia) - nagnjenost k čustvenemu stanju, ki vztraja skozi čas, vztrajajoče ponavljajoče se mišljenje, kot sta ruminacija in zaskrbljenost (perseverative cognition), interoceptija in prožnost pri uravnavanju čustvenih in telesnih odzivov. V prispevku so predstavljene raziskave o dvosmerni komunikaciji med srcem in možgani, variabilnosti srčne frekvence (HRV), ruminaciji in omrežju privzetega načina delovanja (DMN). Na tej podlagi je predstavljen protokol pilotne študije v okviru šole za starše, ki povezuje relacijsko razumevanje ponavljajočih se čustvenih vzorcev z biofeedbackom HRV. Primarni namen je preveriti izvedljivost programa ter pridobiti preliminarne podatke o spremembah v stresu, regulaciji čustev in psihofizioloških kazalnikih.

Ključne besede: starševstvo, čustvena regulacija, variabilnost srčne frekvence, interoceptija, utelešena kognicija, ruminacija, HRV-biofeedback

1 Uvod

Ena od ponavljajočih se izkušenj pri delu s starši je navidezno preprosta, vendar raziskovalno zahtevna. Posameznik lahko zelo dobro ve, kako bi se želel odzvati na otroka, vendar v čustveno intenzivnem trenutku vseeno stori nekaj drugega. Otrokov jok, zavračanje, jeza ali umik lahko v nekaj sekundah sprožijo dobro znano stanje napetosti, ogroženosti, nemoči ali jeze, iz česar sledi prav tako dobro znan odziv. Starševstvo je poseben kontekst čustvene regulacije, saj starš ne uravnava le lastnega čustvenega stanja, temveč s svojim odzivanjem pomembno sodeluje tudi pri otrokovi regulaciji čustev [1]. Meta-analitični podatki kažejo, da je boljša regulacija čustev pri starših povezana z ugodnejšimi starševskimi odzivi. Starši, ki dobro uravnavajo svoja čustva, bolj pogosto uporabljajo pozitivne vzgojne pristope, kar se kaže v čustvenem doživljanju otrok [2].

Takšna razlika med znanjem in dejanskim odzivom je zanimiva tudi za kognitivno znanost. Nakazuje, da samoregulacije ni mogoče razumeti zgolj kot zavestno odločitev. Starševsko odzivanje je umeščeno v telo: spremljajo ga spremembe dihanja in srčnega ritma, napetosti, pozornosti ter zaznane ogroženosti. Prispevek zato ne skuša razložiti starševstva z nevroznanostjo, temveč bolj odpreti vprašanje: ali lahko sprememba psihofiziološkega stanja ustvari več prostora med sprožilcem in avtomatskim odzivom starša?

Prav na tem mestu je utelešena kognicija uporaben povezovalni okvir. Ne pomeni, da telo nadomesti možgane ali da fiziologija določa misel. Poudari pa, da je dostop do znanja odvisen tudi od stanja organizma. Starš lahko v mirnem trenutku razume, da otrok s svojim vedenjem izraža preobremenjenost, vendar v stanju izrazite aktivacije to isto vedenje hitreje interpretira kot nespoštovanje, zavračanje ali izgubo nadzora. Zato nas ne zanima

le kaj starš ve, temveč v kakšnem telesno-čustvenem stanju lahko to znanje uporabi.

2 Ponavljajoča se čustvena stanja

V kliničnem jeziku posamezniki pogosto opisujejo, da se »vedno znova znajdejo v začaranem krogu«. Nekdo se hitro organizira okoli jeze, drugi okoli skrbi, tretji okoli sramu ali nemoči. Izraz »zasvojenost s čustvenimi stanji« poudarja ponavljanje in občutek, da posameznik iz znanega stanja težko izstopi, vendar ga ni primerno enačiti z zasvojenostjo v diagnostičnem ali nevrobiološkem pomenu. Bolj uporaben je pojem afektivne inercije, ki opisuje vztrajanje čustvenega stanja skozi čas. Novejši pregled opozarja, da inercija sama po sebi ni nujno neugodna, pomembni so kontekst, valenca in sposobnost sistema, da se ob spremenjenih zahtevah prilagodi. Nekateri starši se po sprožilcu težko vrnejo iz določenega čustveno-telesnega stanja. Otroku nekaj naredi, starš se aktivira in tudi ko neposredna situacija mine, stanje jeze, ogroženosti, sramu ali nemoči vztraja ter vpliva na naslednje zaznavanje in odzivanje [3].

Drugi bližnji konstrukt je perseverativna kognicija, torej vztrajanje miselnih predstav stresorja v obliki skrbi, ruminacije ali anticipatornega stresa [4]. Takšno mišljenje lahko podaljšuje psihofiziološki odziv tudi po tem, ko neposrednega stresorja ni več. Meta-analiza laboratorijskih študij iz leta 2026 je pokazala povezano perseverativno kognicijo z nižjo vagalno posredovano variabilnostjo srčne frekvence (HRV angl. heart rate variability) v mirovanju ter med reaktivnostjo in okrepanjem [5]. Za starševstvo je zato zanimivo vprašanje ali nekatera ponavljajoča se čustvena stanja vztrajajo tudi zato, ker se medsebojno ojačujejo telesna aktivacija, interpretacija otrokovega vedenja in nadaljnje premlevanje dogodka. Takšno vztrajanje čustvenega stanja je bolje razumeti kot izraz manjše čustvene prožnosti kot pa kot zasvojenost v kliničnem smislu.

V tem smislu se lahko klinični izraz »zasvojenost« prevede v bolj raziskovalno vprašanje o prehodih med stanji. Ni toliko pomembno ali starš pogosto občuti jezo, skrb ali sram, temveč kako hitro se stanje aktivira, koliko časa vztraja, kako močno usmerja pozornost in interpretacijo ter kako dostopen je prehod v drugačen odziv. Zgodnje izkušnje v odnosih pri tem niso obravnavane kot neposreden nevrobiološki vzrok, ampak kot eden od kontekstov učenja. Skozi ponavljajoče se odnose se lahko oblikujejo pričakovanja o dostopnosti, zavrnitvi ali ogroženosti, ki pozneje usmerjajo zaznavanje in interpretacijo odnosnih situacij [6]. Pri tem tudi pomen telesne aktivacije ni odvisen le od fiziološkega signala, temveč ga oblikujejo predhodna pričakovanja in trenutni kontekst [7]. Pilotna raziskava, ki jo predstavljamo v nadaljevanju, tega mehanizma ne bo dokazovala, lahko pa preveri ali starši po programu takšne prehode bolje prepoznavajo in opisujejo.

3 Srce, vagalna regulacija in interoceptija

Variabilnost srčne frekvence (HRV) opisuje spreminjanje intervalov med zaporednimi srčnimi utripi. V modelu nevrovisceralne integracije je HRV razumljena kot periferni kazalnik dinamične regulacije, ki je povezana z omrežji kognitivnega in čustvenega nadzora [8]. Meta-analitični podatki kažejo majhno, vendar konsistentno povezanost med HRV in samoregulacijo [9] ter med vagalno posredovano HRV in nekaterimi izvršilnimi funkcijami, zlasti inhibicijo in kognitivno prožnostjo [10]. HRV zato ni merilo psihološke zrelosti in tudi ne

¹ Prispevek je nastal v okviru projekta "Psihofiziološka koherenca in zasvojenost s čustvenimi stanji pri starših TEOF UL"

neposredna meritev 'moči vagusa', temveč v tem kontekstu občutljiv fiziološki kazalnik, na katerega vplivajo dihanje, telesni položaj, starost, zdravila in številni drugi dejavniki.

Povezavo med srcem in možgani je smiselno razumeti dvosmerno. Možgani prek avtonomnih poti vplivajo na srčni ritem, hkrati pa visceralni in kardiovaskularni aferentni signali prispevajo informacije o trenutnem stanju organizma [11]. Vagusni živec je eden pomembnih nosilcev telesno-možganske komunikacije, vendar ni samostojen »kanal umirjanja«. Njegovo delovanje je del širšega avtonomnega in centralnega regulatornega sistema. Za psihološko razumevanje je posebej pomembna interoceptcija – zaznavanje, integriranje in vrednotenje signalov iz notranjosti telesa – saj sodeluje pri oblikovanju čustvenega doživljanja in vedenjskega odzivanja [12].

Interoceptivno zavedanje lahko staršu omogoči, da prej opazi pospešeno bitje srca, spremembo dihanja ali napetost, še preden se ti občutki organizirajo v izraziti vedenjski impulz. Toda več pozornosti do telesa ni nujno avtomatsko boljše. Telesni signal vedno dobi pomen znotraj pričakovanj, preteklih izkušenj in trenutnega konteksta. Prediktivni modeli interoceptcije zato poudarjajo, da možgani notranjega stanja ne berejo pasivno, temveč ga sproti interpretirajo [13,7]. Prav ta poudarek omogoča povezavo z utelešeno kognicijo. Telesno stanje ni ozadje mišljenja, ampak eden od pogojev v katerih zaznava in presoja nastajata.

Pomembno je tudi razlikovati med interoceptivno natančnostjo, pozornostjo do telesnih signalov in subjektivnim občutkom, da posameznik svoje telo dobro zaznava. Ti vidiki se nujno ne prekrivajo. Posameznik je lahko zelo pozoren na srčni utrip in napetost, vendar ju razlaga katastrofično, pri drugem lahko boljše prepoznavanje zgodnje aktivacije pomeni možnost za pravočasnejšo regulacijo. Za program s starši je zato bolj pomembno vprašanje ali se spreminja način kako telesni signal prepoznajo in mu pripišejo pomen, ne pa zgolj to ali ga zaznajo.

4 Ruminacija, DMN in utelešena kognicija

V literaturi o ruminaciji se pogosto pojavlja omrežje privzetega načina delovanja (DMN angl. default mode network), ki sodeluje pri samoreferenčnem mišljenju, avtobiografskem spominu in spontanem notranjem toku misli. Meta-analiza nevroslikovnih študij je pokazala, da je ruminacija povezana s spremenjeno funkcionalno povezanostjo znotraj DMN in z njegovim sodelovanjem z drugimi možganskimi omrežji [14]. Iz tega ni mogoče sklepati, da se pri učinkoviti regulaciji DMN preprosto ugasne. Bolj smiselno je govoriti o spremembah dinamike med samoreferenčnim procesiranjem, zaznavanjem pomembnosti dražljajev in kognitivnim nadzorom.

Zanimiva je randomizirana raziskava HRV-biofeedbacka, v kateri skupinski učinek intervencije na DMN ni bil enoznačen, vendar je bila večja amplituda srčnih oscilacij med vadbo povezana z zmanjšanjem negativnega tavanja misli in zmanjšanjem funkcionalne povezanosti med jedrom DMN in orbitofrontalnim korteksom [15]. Tega rezultata ne gre prenesti neposredno na starševstvo in kot bo predstavljeno v nadaljevanju, tudi v naši pilotni raziskavi možganske aktivnosti ne merimo. Raziskava je pomembna predvsem zato, ker pokaže, da je mogoče srčno-avtonomne spremembe raziskovati skupaj s kognitivnimi procesi, ne da bi eno raven reducirali na drugo.

Podobna previdnost je potrebna pri ruminaciji. DMN ni 'slabo' omrežje, ki bi ga bilo treba utišati, saj sodeluje pri spominu, mišljenju o sebi in socialni kogniciji. Težava je lahko predvsem v rigidnosti in neuspešnem preklapljanju med notranje usmerjenim procesiranjem in zahtevami trenutne situacije. Pri staršu, ki po konfliktu z otrokom še dolgo premleva dogodek, je zato bolj zanimivo vprašanje regulacijske prožnosti kot pa raven aktivnosti posamezne možganske mreže. Takšna formulacija omogoča uporabo nevroznanstvene literature kot širšega konteksta, ne da bi iz psihofiziološke meritve sklepali na specifično možgansko dogajanje.

5 Od psihofiziološke regulacije do starševskega odziva

HRV-biofeedback praviloma uporablja počasno ritmično dihanje, pogosto v bližini posameznikove resonančne frekvence, s čimer se povečajo respiratorna sinusna aritmija in barorefleksna nihanja [16]. Sistematični pregled metod HRV-biofeedbacka kaže

obetavne učinke, hkrati pa veliko heterogenost protokolov in potrebo po natančnem poročanju merilnih pogojev [17]. Inner Balance je komercialni sistem za HRV-biofeedback, ki so ga razvili v podjetju HeartMath. Uporablja aplikacijo in manjši optični senzor na ušesni mečici, ki zaznava pulz ter iz njega ocenjuje spremembe v srčnem ritmu, pri tem pa ne snema elektrokardiograma. Z optičnim fotopletizmografskim (PPG) senzorjem na ušesni mečici zaznava pulzni val in iz časov med zaporednimi pulznimi valovi določa intervale med utripi (inter-beat intervals, IBI), ki jih aplikacija uporablja za prikaz variabilnosti srčne frekvence in izračun indeksa koherence (coherence score). Ta indeks opisuje urejenost oziroma periodičnost vzorca variabilnosti in ga ni mogoče enačiti z standardnimi merami HRV, kot so RMSSD (kvadratni koren povprečja kvadratov razlik med zaporednimi intervali), lnRMSSD (logaritemsko transformiran RMSSD), SDNN (standardni odklon intervalov med normalnimi utripi) in HF-HRV (visokofrekvenčna komponenta HRV), niti z neposredno vagalno aktivnostjo ali neposredno »srčno-možgansko koherenco«. Validacijska raziskava PPG naprav, ki je vključevala Inner Balance Bluetooth, je pokazala, da so meritve srčne frekvence praviloma natančnejše od meritev HRV in da se skladnost z EKG poslabša predvsem ob gibanju, kar govori v prid standardiziranim meritvam v mirovanju [18].

V praksi se počasno dihanje pogosto povezuje tudi z namernim priklicem občutkov kot so npr. hvaležnost in sočutje. Znanstveno bi bilo preveč poenostavljeno trditi, da pozitivno čustvo najprej uredi srce, srce pa nato izboljša mišljenje. Bolj verjetno je, da se hkrati spreminjajo pozornost, kognitivna ocena situacije, dihanje, avtonomna aktivacija in interoceptivni kontekst. Za starša je lahko pomemben prav ta skupni proces: sprememba telesnega stanja lahko olajša drugačno presojo, drugačna presoja pa povratno vpliva na telesno in čustveno stanje.

Starševski kontekst temu doda odnosni vidik. Sistematični pregled fiziološke sinhronosti med skrbniki in otroki opozarja, da večja fiziološka usklajenost ni sama po sebi boljša, njen pomen je odvisen od razvojnega in odnosnega konteksta [19]. Cilj samoregulacije zato ni stalno mirno ali pozitivno stanje. Pomembna je regulacijska prožnost, kjer so sposobni opaziti, da se telo in mišljenje organizirata okoli starega vzorca, ter se po aktivaciji dovolj hitro vrniti v stanje, v katerem je ponovno dostopnih več možnosti za odziv. V tem smislu starševski odziv ni le vedenjska tehnika, ampak utelešeni kognitivni in odnosni proces.

6 Pilotna študija v okviru šole za starše

Pilotna študija Psihofiziološka koherenca in zasvojenost s čustvenimi stanji pri starših je zasnovana kot skupinska prospektivna raziskava z meritvami pred programom in po njem ter z mešanim raziskovalnim pristopom. Vključenih bo 10 polnoletnih staršev, ki bodo sodelovali v šestih srečanjih šole za starše. Program povezuje prepoznavanje ponavljajočih se čustvenih in telesnih stanj, refleksijo povezav med zgodnjimi odnosi in sedanjo starševsko reaktivnostjo, relacijsko-družinsko razumevanje odzivov ter učenje psihofiziološke samoregulacije z biofeedbackom Inner Balance.

Primarni namen pilotne študije ni dokazovanje učinkovitosti, temveč preverjanje izvedljivosti in doživljanja. S tem mislimo na vključevanje udeležencev, udeležbe na srečanjih, izvedljivosti meritev, tehničnih težav ter subjektivnega doživljanja. Preliminarno bodo pred programom in po njem ocenjeni zaznani stres in težave pri regulaciji čustev. Za regulacijo čustev je predvidena kratka lestvica DERS-16 [20]; pri izboru mer stresa pa PSS-10 [21].

Raziskovalna vprašanja so zato zastavljena predvsem eksploratorno. Zanima nas ali je tak program za starše sprejemljiv in izvedljiv, ali se po njem pokažejo preliminarni premiki v zaznanem stresu in regulaciji čustev ter ali se pri fiziološkem podvzoru po programu pokažejo spremembe v indeksu koherence sistema Inner Balance. Kvalitativni del bo dodatno raziskal kako starši sami opisujejo stanja v katera se pogosto vračajo, kako jih povezujejo z odzivanjem do otroka in ali po programu zaznajo več prostora med aktivacijo in vedenjskim impulzom. Subjektivno doživljanje je pomembno, ker lahko

pokaže, ali je predlagani teoretični jezik za udeležence sploh razumljiv in uporaben.

Pri fiziološkem podvzorcju bo protokol vključeval petminutno meritev v mirovanju ob spontanem dihanju in petminutno standardizirano koherentno nalogo. Če bo tehnično omogočen zanesljiv izvoz IBI in bo kakovost PPG-signalov ustrezna, bo iz teh intervalov izračunan lnRMSSD kot standardni časovno-domenski kazalnik HRV. HeartMathov coherence score bo analiziran ločeno kot indeks urejenosti vzorca variabilnosti med koherentno nalogo, ne kot zamenjava za standardne HRV-kazalnike ali neposredna mera vagalne aktivnosti. Pri približno 8–10 udeležencih so predvideni tudi polstrukturirani intervjuji o ponavljajočih se čustveno-telesnih stanjih, odzivih do otrok in izkušnji biofeedbacka, analizirani s tematsko analizo [22]. Kvantitativne spremembe bodo pri majhnem pilotskem vzorcu interpretirane predvsem z velikostmi učinkov in intervali negotovosti, ne zgolj s p-vrednostmi.

7 Razprava in sklep

Osrednje vprašanje tega prispevka ni, ali »srce vodi možgane«, temveč kako telesno stanje sodeluje pri nastajanju zaznave, čustva, misli in odnosa. Dosedanje raziskave ponujajo posamezne, med seboj povezane ugotovitve. Starševska regulacija je pomembna za kakovost odzivanja [1,2], perseverativna kognicija je povezana z avtonomno regulacijo [5], HRV z nekaterimi vidiki samoregulacije in izvršilnega delovanja [8–10], interoceptija pa predstavlja enega od mostov med telesnimi signali in čustveno-kognitivnim procesiranjem [11–13]. Raziskave DMN in HRV-biofeedbacka dodatno odpirajo vprašanja o odnosu med telesno regulacijo in samoreferenčnim mišljenjem [14,15], vendar za zdaj ne upravičujejo enostavnih vzročnih razlag.

Pilotna študija zato ostaja namenoma skromna. Ne preverja zasvojenosti s čustvi kot diagnoze in ne meri sprememb v možganih. Preverja ali je za starše izvedljiv pristop, ki jim pomaga prej prepoznati lastno aktivacijo, jo povezati z znanim čustveno-odnosnim vzorcem in pred odzivom ustvariti nekoliko več regulacijske prožnosti. Če se ob tem pokažejo tudi preliminarne spremembe v stresu, regulaciji čustev, starševski kompetentnosti ali HRV, bodo te ugotovitve predvsem izhodišče za večjo raziskavo. Prav v tej previdni povezavi med kliničnim opažanjem, merljivo fiziologijo in kognitivnimi procesi je lahko prispevek utelešene kognicije k raziskovanju starševstva.

Nekatere omejitve opredeljujemo vnaprej. Enoskupinska zasnova ne bo omogočala pripisovanja sprememb posamezni komponenti programa, majhen nenaključni vzorec pa ne omogoča širšega posploševanja. Na HRV vplivajo številni fiziološki in situacijski dejavniki; pri PPG-meritvah dodatno vplivata kakovost pulznega signala in gibanje, HeartMathov indeks koherence pa je kazalnik naprave. Tudi kvalitativna poročila o večjem zavedanju še niso dokaz spremembe dejanskega vedenja v družini. Naslednji korak bi zato zahteval primerjalno skupino, strogo standardizirane fiziološke meritve ter neposredne kazalnike starševskega odzivanja. Za bolj natančno validacijo HRV bi bilo smiselno vključiti tudi EKG-referenčno meritev. Sedanji pilot je namenjen predvsem temu, da pokaže, ali je takšen raziskovalni model dovolj jasen, izvedljiv in merljiv, da ga je smiselno tovrstno nadalje raziskovati.

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Igriva fascijalna vadba za otroke in mladostnike s posebnimi potrebami

Tina Bregant[†]

CIRIUS Kamnik

Slovenija

tina.bregant@cirius-kamnik.si

Darja Popović

CIRIUS Kamnik

Slovenija

darja.popovic@cirius-kamnik.si

Katja Logar

CIRIUS Kamnik

Slovenija

katja.logar@cirius-kamnik.si

Povzetek

Izhodišča: Nedavne raziskave poudarjajo, da fascija ni le pasivno vezivno tkivo, temveč dinamičen sistem z pomembno vlogo pri mehanski stabilnosti, zaznavanju gibanja in koordinaciji. Otroci in mladostniki s posebnimi potrebami vse pogosteje uporabljajo prilagojene vadbene načrte, ki vključujejo raztezanje, koordinacijo in živčnomišični trening z namenom povečanja upora, gibljivosti in učinkovitosti prenosa sile v telesu. Pomemben vidik je vključitev igre, ki spodbuja notranjo motivacijo, povečuje vključenost in zmanjšuje upor gibanju, kar omogoča večjo doslednost pri vadbi. Dinamične igrive dejavnosti (npr. skakanje, skakanje, koordinacijske naloge) dodatno podpirajo elastične lastnosti fascijalnega sistema in utrjujejo ustrezne vzorce gibanja.

Cilj: Razviti in preizkusiti fascijalno vadbo za otroke in mladostnike s posebnimi potrebami kot del rehabilitacijske obravnave.

Metode: Fizioterapevti v Cirius Kamniku razvijamo vadbeni program, ki celovito vključuje elemente igre, gibanja in obravnave fascijalnega sistema. Sestavili smo nabor vaj in vadbo ter jo preizkusili sistematično na skupini šestih otrok, starih od 8 do 12 let, ki so vadili dvakrat tedensko v obdobju šestih tednov. Za spremljanje kvantitativnih kazalnikov učinkovitosti vadbe smo uporabili tri standardizirane teste. Pred in po vsaki vadbeni seriji smo izvedli test sedečega upogiba naprej, da bi ugotovili neposredne učinke vadbe. Za oceno sprememb v ravnotežju in eksplozivni moči so bili uporabljeni skok v daljino stoje in stoja na eni nogi (na trdi in mehki podlagi) pred in po začetku šesttedenskega obdobja treninga.

Rezultati: Šesttedenska intervencija kaže dosledno izboljšanje pri vseh treh merjenih funkcionalnih sposobnostih — mobilnosti, eksplozivni moči in ravnotežju — pri vseh šestih udeležencih programa. Pri gibljivosti hrbtenice (test sedečega predklona) se je povprečna vrednost izboljšala z 29,45 cm na 32,90 cm (+3,45 cm), z naraščajočim trendom, vidnim tako med fazami pred/po kot znotraj vsake faze v 12 zaporednih meritvah, kar nakazuje postopni in kumulativni učinek treninga. Pri eksplozivni moči spodnjih okončin (skok v daljino iz stoja) se je povprečje povečalo s 69,00 cm na 78,83 cm (+9,83 cm, približno 14 % relativni napredek), kar je največji relativni napredek med tremi testi. Pri statičnem ravnotežju (stoja na eni nogi) je bila izboljšava prisotna na obeh površinah, a sorazmerno bolj izrazita na nestabilni (mehki) površini s 7,31 s na 12,89 s (+5,58 s) kot na trdni površini od 14,29 s do 23,95 s (+9,66 s), kar je skladno s pričakovanim učinkom treninga na senzomotorični nadzor in propriocepcijo.

Ključne besede

Fascija, fascijalni sistem, živčnomišični trening, spodnji udi, hrbtenica, eksplozivna moč

Introduction: Recent research highlights that fascia is not just a passive connective tissue but a dynamic system with important role in mechanical stability, motion perception, and coordination. Children and adolescents with special needs are increasingly using adapted exercise plans that include stretching, coordination, and neuromuscular training with the aim of increasing resistance, flexibility, and efficiency of force transmission in the body. An important aspect is the inclusion of play which stimulates intrinsic motivation, increases involvement, and reduces resistance to movement, allowing for greater consistency in exercise. Dynamic playful activities (e.g. jumping, jumping, coordination tasks) additionally support elastic properties of the fascial system and enforce appropriate movement patterns.

Aim: To develop and test a new rehabilitational training for children and adolescents with special care needs.

Methods: Physiotherapists at Cirius Kamnik are developing an exercise program which comprehensively includes elements of play, movement, and treatment of the fascial system. Preliminary study included a sample of six children between the ages of 8 and 12 years who performed exercises twice a week over a period of six weeks. Three standardized tests were used to monitor quantitative indicators of exercise effectiveness. A seated forward bend test was performed before and after each training session to determine the direct effects of exercise. Standing long jump and single leg stance (on firm and soft surface) before and after the start of the six-week training period was used to assess changes in balance and explosive power.

Results: Six-week fascial intervention showed a consistent improvement across all three measured functional abilities — mobility, explosive power, and balance — in all six participants of the programme. In spinal and posterior chain mobility (seated forward bend test), the average value improved from 29.45 cm to 32.90 cm (+3.45 cm), with an upward trend visible both between the before/after phases and within each phase across the 12 consecutive measurements, suggesting a gradual and cumulative training effect. In lower-limb explosive power (standing long jump), the average rose from 69.00 cm to 78.83 cm (+9.83 cm, approximately a 14% relative improvement), the largest relative gain among the three tests. In static balance (single-leg stance), improvement was present on both surfaces, but proportionally more pronounced on the unstable (soft) surface from 7.31 s to 12.89 s (+5.58 s) than on the firm surface from 14.29 s to 23.95 s (+9.66 s), which is consistent with the expected effect of training on sensorimotor control and proprioception.

Conclusions: Based on current research, we conclude that the combination of fascial approach and play significantly contributes to the improvement of motor skills and quality of life of children and adolescents with special needs. Further research is needed to confirm long-term effects and standardize approaches.

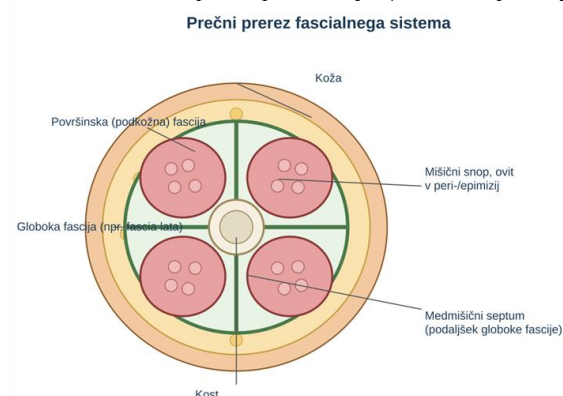
Keywords

Fascia, fascial system, neuromuscular training, lower limbs, spine, explosive power

1 Uvod

Fascija je vezivnotkivna ovojnica, ki v neprekinjeni strukturi povezuje kožo, mišice, kosti, žile, živce in notranje organe. Sodobna literatura ločuje anatomsko strukturo (t.i. "fascija") od funkcionalnega pojma "fascijalni sistem", ki zajema medsebojno povezane vezivnotkivne komponente in poudarja njihovo skupno vlogo pri gibanju in drži telesa. Poenostavljeno ločimo površinsko (podkožno) fascijo, ki leži tik pod kožo, in globoko fascijo, ki ovija mišice ter se nadaljuje v medmišične septume, ovojnice posameznih mišičnih snopov (perimizij) in vlaken (endomizij).

Slika 1: Shematski prečni prerez slojev (izdelano s pomočjo UI).



Fascijalno tkivo je bilo dolgo obravnavano zgolj kot pasivna ovojnica mišic, vendar sodobne raziskave kažejo, da gre za dinamičen, tridimenzionalen mrežni sistem, ki povezuje mišice, kosti, živce in notranje organe ter ima pomembno vlogo pri prenosu mehanske sile, drži telesa in senzorični povratni informaciji [1]. Znotraj fascijalnega tkiva je gosta mreža mehanoreceptorjev in nociceptorjev, ki prispevajo k proprioceptiji in zaznavanju gibanja, kar fascijo umešča med ključne strukture nadzora drže in koordinacije [2]. Fascija ni le mehansko, ampak tudi biološko aktivno tkivo — vsebuje mifibroblaste, ki lahko aktivno spreminjajo napetost tkiva in s

tem vplivajo na mišično-skeletno dinamiko, njena togost pa se prilagaja tudi raztezanju in gibalni obremenitvi [4] [5].

Slika 2: Vloga fascijalnega sistema pri gibanju in drži (izdelano s pomočjo UI).



Pri otrocih in mladostnikih s posebnimi potrebami se v obravnavo vse pogostejše vključujejo prilagojeni gibalni programi, ki združujejo raztezanje, koordinacijske naloge in nevromuskularni trening z namenom izboljšanja gibljivosti, moči in učinkovitosti prenosa sile v telesu. Pomembno vlogo pri tem ima vključevanje igre, ki spodbuja notranjo motivacijo, povečuje vključenost otroka in zmanjšuje odpor do gibanja, kar omogoča večjo doslednost pri izvajanju vadbe. V Cirius Kamnik so fizioterapevti na podlagi teh izhodišč razvili igrivo fascijalno vadbo za otroke in mladostnike s posebnimi potrebami, ki smo jo tudi preizkusili v praksi in preizkusili njene učinke z meritvami.

2 Vloga igre in notranje motivacije pri gibalni obravnavi otrok in mladostnikov s posebnimi potrebami

Vključevanje igre v gibalno vadbo otrok s posebnimi potrebami ni le motivacijski dodatek, temveč dejavnik, ki neposredno vpliva na izvedljivost in učinkovitost programa. Študija izvedljivosti programa igrive telesne dejavnosti pri otrocih z motnjami v duševnem razvoju je pokazala visoko stopnjo sodelovanja in zadrževanja udeležencev v programu, kar kaže, da strukturirana igra v kombinaciji s prostim gibanjem dobro deluje tudi pri populaciji s posebnimi potrebami [6]. Sistematični pregled šolskih gibalnih programov prav tako izpostavlja, da je notranja motivacija ključni dejavnik za začetek in vzdrževanje zdravih gibalnih navad, zato programi vse pogostejše vključujejo motivacijske strategije za povečanje udeležbe otrok in mladostnikov pri telesni dejavnosti [7].

Podobno je randomizirana raziskava igrive telesne dejavnosti pri otrocih pokazala izboljšanje temeljnih gibalnih spretnosti po desettedenskem programu, ki je vključeval kombinacijo vodenih iger in prostega gibanja [8]. Igra in igriva vadba torej ne deluje zgolj kot spodbuda za sodelovanje, temveč je vgrajena v sam

mehanizem gibalnega učenja — z zmanjševanjem strahu pred neuspehom in povečevanjem števila ponovitev giba, ki jih otrok prostovoljno izvede, kar je pri otrocih s posebnimi potrebami še posebej pomembno, saj so ti pogosto manj telesno dejavni od svojih vrstnikov brez posebnih potreb.

3 Program igrive vadbe: zasnova in metode

Gre za vadbeni program, ki sta ga razvili fizioterapevtki v Cirius Kamnik in ki celostno združuje elemente igre, gibanja in obravnave fascijalnega sistema. Gre za specializiran program vadbe, namenjen posameznikom s posebnimi potrebami. Njegova največja prednost je združevanje fizioterapevtskih načel, ki temeljijo na dokazih, z igrivim, sproščenim in privlačnim pristopom. Program spodbuja kakovostno gibanje, senzorično zavedanje in aktivno sodelovanje prek zabavnih dejavnosti. Sestavljen je iz osmih vaj, ki jih navdihujeta narava in vsakdanje življenje: kot so t.i. položaji ali slike: GORA, RAST, MORSKA ALGA, MAVRICA, KAPNIK, HOJA, OKOLI SONCA in VALOVI.

4 Raziskava

Metode

V raziskavo je bilo vključenih 6 otrok in mladostnikov, starih med 8 in 12 let z možgansko okvaro, ki je nastala perinatalno (v prvih tednih po rojstvu oz. ob rojstvu). Učinkovitost vadbe je bila spremljana s tremi standardiziranimi testi: testom predklona sede (za oceno mobilnosti hrbtenice in zadnje mišično-fascijalne verige), skokom v daljino z mesta (za oceno eksplozivne moči) ter stojo na eni nogi na trdi in mehki podlagi (za oceno statičnega ravnotežja). Test predklona sede je bil izveden pred vsako vadbeno enoto in po njej, s čimer so ocenili neposreden učinek posamezne vadbe, medtem ko sta bila skok v daljino z mesta in stoja na eni nogi izmerjena pred začetkom in po zaključku šesttedenskega programa.

V analizi smo zaradi majhnega vzorca in boljše povednosti glede izboljšanja funkcije rok uporabili deskriptivno statistiko.

Rezultati

Rezultati so pokazali izboljšanje funkcije.

4.1 Gibljivost hrbtenice in zadnje mišično-fascijalne verige

Pri testu predklona sede se je povprečna vrednost izboljšala z 29,45 cm na 32,90 cm (+3,45 cm), pri čemer je bil naraščajoč trend viden tako med fazama pred/po vadbi kot tudi znotraj posamezne faze prek 12 zaporednih meritev, kar nakazuje na postopen in kumulativen učinek vadbe. Ta vzorec je skladen z ugotovitvami, da se togost globoke fascije zmanjša že po kratkotrajnem raztezanju in da se ta učinek pri ponavljajoči se vadbi kaže tudi kot dolgoročnejša prilagoditev veziva [5]. Sistematični pregledi pri mladostnikih prav tako potrjujejo, da vadba, ki vključuje elemente eksplozivnega gibanja, poleg moči izboljšuje tudi gibljivost zadnje mišično-fascijalne verige, merjeno s testom sede, kar podpira kombinirani pristop našega

programa, ki gibljivost in eksplozivno moč obravnava sočasno [14].

4.2 Eksplozivna moč spodnjih okončin

Pri skoku v daljino z mesta se je povprečna vrednost dvignila z 69,00 cm na 78,83 cm (+9,83 cm, približno 14-odstotno relativno izboljšanje), kar je bil največji relativni napredek med tremi merjenimi sposobnostmi. Metaanaliza učinkov pliometrične vadbe pri mladostnih športnikih je pokazala, da tovrstna vadba statistično značilno izboljša eksplozivno moč spodnjih okončin, med drugim tudi rezultat skoka v daljino z mesta [11]. Podobno je sistematični pregled s pripadajočo metaanalizo pri mladostnikih v ekipnih športih potrdil izboljšanje skoka v daljino z mesta z visoko velikostjo učinka, poleg tega pa tudi izboljšanje sprinta in sprememb smeri gibanja, kar kaže, da eksplozivna vadba vpliva širše na nevrnomuskularno učinkovitost, ne le na en sam gibalni vzorec [12]. Zanimivo je, da je skok v daljino z mesta v raziskavah povezan tudi s širšimi zdravstvenimi kazalniki pri mladostnikih, kot so telesna sestava, kakovost spanja in psihično počutje, kar rezultatom našega programa daje pomen, ki presega zgolj gibalno področje [13].

4.3 Statično ravnotežje in propriocepcija

Pri stoju na eni nogi je bilo izboljšanje prisotno na obeh podlagah, a sorazmerno bolj izrazito na nestabilni (mehki) podlagi, kjer se je vrednost izboljšala s 7,31 s na 12,89 s (+5,58 s), v primerjavi s trdo podlago, kjer se je vrednost izboljšala s 14,29 s na 23,95 s (+9,66 s). Takšen vzorec je skladen s pričakovanim učinkom vadbe na senzomotorični nadzor in propriocepcijo [9]. Randomizirana raziskava ravnotežnega treninga na različnih podlagah pri otrocih s cerebralno paralizo je pokazala, da vadba na nestabilnih podlagah značilno izboljša položajni čut v gležnju, kar podpira uporabo mehke podlage kot ciljne obremenitve za propriocepcijo, ne le kot težjo različico enake naloge [9]. Tudi pri mladostnikih so raziskave proprioceptivnega treninga pokazale sočasno izboljšanje dinamičnega ravnotežja in eksplozivne moči, kar kaže, da ravnotežni in eksplozivni elementi vadbe drug drugega funkcionalno dopolnjujejo, kar je skladno z zasnovo program, ki oba elementa vključuje vzporedno [10].

5 Zaključek

Zanimivo je, da izboljšanja pri vseh treh testih pri udeležencih programa niso bila izolirana, temveč so se pojavljala vzporedno pri istih otrocih. Tak vzorec je skladen z razumevanjem fascijalnega sistema kot celostne, medsebojno povezane mreže, kjer sprememba togosti ali gibljivosti v enem delu telesa vpliva na prenos sile in nadzor giba tudi drugod, saj fascijalne verige mehansko povezujejo sosednje mišice in celo oddaljene telesne segmente [1]. Kombinirane, igrive naloge hkrati krepijo gibljivost, moč in ravnotežje. Tovrsten celostni pristop je skladen z ugotovitvami, da neuravnotežena vadba, osredotočena zgolj na moč ali zgolj na gibljivost, redkeje prinese enakovredne izboljšave na vseh področjih motorike, medtem ko kombinirani programi, ki vključujejo elemente pliometrije, ravnotežja in raztezanja, dosledneje izboljšajo več gibalnih sposobnosti hkrati [12] [14].

Izboljšanje gibalnih sposobnosti pri otrocih s posebnimi potrebami ni pomembno samo po sebi, temveč je tesno povezano tudi s širšo udeležbo v vsakdanjih dejavnostih in kakovostjo življenja. Sistematični pregled prilagojene telesne dejavnosti pri otrocih in mladostnikih z nevro-motorično motnjo je pokazal, da tovrstni programi izboljšujejo grobo motoriko in kakovost življenja, čeprav je kakovost dokazov na tem področju še vedno omejena [15]. Podobno sistematični pregled gibalnih in telesno-dejavnostnih programov pri otrocih z avtističnimi motnjami navaja, da tovrstne intervencije izboljšujejo motorični razvoj in imajo potencial za izboljšanje neodvisnosti ter kakovosti življenja, čeprav je metodološka kakovost vključenih raziskav pogosto nizka [16]. Poleg motoričnih učinkov so gibalne intervencije pri otrocih s posebnimi vzgojno-izobraževalnimi potrebami povezane tudi s kognitivnimi in učnimi izidi, kar kaže, da imajo lahko podobni programi širši vpliv na otrokov razvoj, ne le na izmerjene gibalne parametre [17], saj je potrebno upoštevati tudi psihosocialno razsežnost programov, ki temeljijo na igri. Ker otroci s posebnimi potrebami pogosto doživljajo manj uspešnih izkušenj pri telesni dejavnosti kot njihovi vrstniki, lahko igriv, individualiziran prispeva tudi k občutku kompetentnosti in sodelovanja, kar je v literaturi prepoznano kot pomemben dejavnik dolgoročne vključenosti v gibalno dejavnost [7] [8].

Omejitve in usmeritve za nadaljnje raziskave

Predstavljeni rezultati izhajajo iz majhnega vzorca šestih udeležencev brez kontrolne skupine, zato jih je treba obravnavati kot predhodne. Podobne omejitve — majhni vzorci, kratko trajanje vadbe in odsotnost kontrolnih skupin — so pogosto prisotne tudi v širši literaturi o gibalnih intervencijah pri otrocih s posebnimi potrebami, kar sistematični pregledi izpostavljajo kot oviro za posploševanje ugotovitev [15] [16]. Za potrditev dolgoročnih učinkov in standardizacijo pristopa fascijalne vadbe bodo potrebne nadaljnje raziskave z večjim številom udeležencev, kontrolno skupino in daljšim obdobjem spremljanja, po možnosti z vključitvijo dodatnih izidov, kot so udeležba v vsakdanjih dejavnostih in samoocenjena kakovost življenja.

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Vizualizacija scenarijev prihodnosti tehnoloških civilizacij

Visualizing Future Scenarios for Technological Civilizations

Aleksander Kosanović
Institut "Jožef Stefan"
Ljubljana, Slovenija
ak57749@student.uni-lj.si

Julija Stopar
Institut "Jožef Stefan"
Ljubljana, Slovenija
julija.stopar@ijs.si

Matjaž Gams
Institut "Jožef Stefan"
Ljubljana, Slovenija
matjaz.gams@ijs.si

Povzetek

Ponovno analiziramo, kako dolgo bi lahko obstajala človeška tehnološka civilizacija, pri čemer tokrat uporabljamo doslej najcelovitejši in najkompleksnejši pristop. Drakova enačba in njene razširitve niso zgolj računska orodja za ocenjevanje številčnosti tehnoloških civilizacij, temveč tudi formalne reprezentacije sklepanja v razmerah globoke negotovosti. V prispevku Drakove, Brinove in modele redke Zemlje obravnavamo kot generatorje scenarijev. Njihove semantično različne izhode uskladimo s povezovalno diagnostično količino N^* ter jih prikažemo v prostoru aktivne življenjske dobe L_{active} in diagnostične vrednosti N^* . Gostotno karto enakomerno uteženega supermodela SM1 razdelimo na štiri režime. Največji delež utežene mase pripada prehodnemu režimu R_2 , in sicer 43,7 %, sledi pa mu dolgoživi režim z visoko diagnostično vrednostjo R_4 , ki obsega 35,9 %; tudi globalni maksimum glajene gostote leži v režimu R_2 . Primerjava treh nastavitvev uteži supermodela pokaže, da se v obravnavanem zaporedju SM4–SM1–SM5, v katerem narašča relativni prispevek naseljitvenih komponent, povečuje tudi masa režima R_4 . Rezultati ne predstavljajo empiričnih verjetnosti za Galaksijo, temveč opisujejo lastnosti modelno inducirane prostora scenarijev. Gostotno karto in primerjavo mas posameznih režimov obravnavamo kot komplementarni zunanji reprezentaciji, ki razkrivata strukturo scenarijskega prostora ter omogočata sistematično primerjavo različnih modelnih predpostavk.

Abstract

We revisit the question of how long human technological civilization might persist, this time using our most comprehensive and complex approach to date. The Drake equation and its extensions are not merely computational tools for estimating the number of technological civilizations, but also formal representations of reasoning under deep uncertainty. In this study, we treat the Drake, Brin, and Rare Earth models as scenario generators. We align their semantically distinct outputs by means of the bridging diagnostic quantity N^* and represent them in the space defined by active lifetime L_{active} and diagnostic value N^* . We divide the density map of the uniformly weighted supermodel SM1 into four regimes. The transitional regime R_2 contains the largest share of the weighted mass, at 43.7 %, followed by the long-lived, high-diagnostic-value regime R_4 , at 35.9 %; the global maximum of the smoothed density also lies within regime R_2 . A comparison of three supermodel weighting configurations shows that, across the sequence SM4–SM1–SM5, in which the relative contribution of settlement-related components increases, the mass assigned

to regime R_4 also grows. These results should not be interpreted as empirical probabilities for the Galaxy, but rather as properties of a model-induced scenario space. We treat the density map and the comparison of regime masses as complementary external representations that reveal the structure of the scenario space and enable systematic comparison among different modeling assumptions.

Ključne besede

Drakova enačba, Fermijev paradoks, negotovost parametrov, kognitivne reprezentacije, scenarijska analiza, tehnološke civilizacije

Keywords

Drake equation, Fermi paradox, reasoning under uncertainty, cognitive representations, scenario analysis, technological civilizations

1 Uvod

Ponovno se lotevamo računanja dolgoživosti oz. pričakovane življenjske dobe človeške tehnološke civilizacije. Naše izhodišče je Fermijev paradoks - zakaj kljub ogromnemu številu planetov ne dobimo stika z drugimi civilizacijami? Problem ni le ocenjevanje civilizacijske številčnosti ali dolgoživosti, temveč tudi organizacija sklepanja pri veliki negotovosti.

Najbolj znan formalni okvir za takšno organizacijo je prilagojena Drakova enačba

$$N_{\text{active}} = R_* f_p n_e f_i f_a L_{\text{active}}, \quad (1)$$

ki problem razgradi na astrofizikalne, planetarne, biološke in tehnološke faktorje [1, 2]. Enačba ni empirični zakon v običajnem fizikalnem smislu. Njena ključna funkcija je reprezentacijska: določi, katere neznane količine štejemo za odločilne in kako kompleksno vprašanje razdelimo na obvladljive podprobleme.

Kasnejše modelne družine spremenijo strukturo te reprezentacije. Brinovi modeli uvedejo prostorsko širjenje in razliko med neodvisnim civilizacijskim izvorom ter naseljeno lokacijo [3]. Rare-Earth pristopi poudarjajo redkost planetarnih, geofizikalnih in bioloških pogojev pred nastankom tehnološke inteligence [4]. Stohastične in probabilistične analize dodatno pokažejo, da široki intervali vhodne negotovosti bistveno vplivajo na interpretacijo Fermijevega paradoksa [5, 6, 7]. Te modelne družine zato niso le različni postopki za ocenjevanje istega števila, temveč različni načini organizacije istega problemskega prostora.

Takšna uporaba modelov je povezana z omejeno racionalnostjo: kadar popolno znanje ni dostopno, formalne reprezentacije negotovosti ne odstranijo, temveč omogočijo njeno strukturirano obravnavo [8]. Gostotna karta prikaže porazdelitev scenarijev, zloženi stolpčni diagram pa omogoča primerjavo režimskih deležev. V kognitivni znanosti takšne prikaze obravnavamo kot zunanje reprezentacije [9, 10]. V tem prispevku zunanjo reprezentacijo razumemo kot grafično ali simbolno strukturo, ki izbrane odnose

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v modelnem prostoru prenese v obliko, dostopno neposredni vizualni primerjavi, zaznavanju vzorcev in kategorizaciji. Gostotna karta eksternalizira zvezno porazdelitev scenarijev, režimska particija pa kontinuirani prostor pretvori v omejeno množico primerljivih kategorij. Njuno kognitivno učinkovitost obravnavamo kot teoretično-metodološko hipotezo in ne kot eksperimentalno potrjen učinek. Gostotna karta omogoča pregled skupne porazdelitve scenarijev, primerjava režimskih mas pa neposrednejši prikaz njihove odvisnosti od modelnih predpostavk.

Osrednje raziskovalno vprašanje je, kako lahko semantično heterogene izhode različnih modelov tehnoloških civilizacij poravnamo v skupen diagnostični prostor ter kako lahko gostotna karta in primerjava režimskih mas eksternalizirata njegovo strukturo in odvisnost od modelnih predpostavk. Prispevek ima tri glavne korake: (1) uvede premostitveno diagnostično količino N^* , (2) skupni prostor razdeli na štiri režime in izračuna njihove utežene mase ter (3) s tremi alternativnimi nastavitvami supermodelnih uteži preveri, kako se režimska porazdelitev odzove na spremembo relativnega prispevka naselitvenih komponent.

2 Metoda: modeli kot generatorji scenarijev

Računski okvir sestavlja pet modelnih komponent: standardni Drakov model (I), reducirani Drakov model (II), prostorski naselitveni model (IIIA), multiplikativni naselitveni model z diagnostiko nezaznave (IIIB-M) in Rare-Earth model (IV). Posamezna komponenta vhodne predpostavke preslika v aktivno življenjsko dobo L_{active} in modelno specifično merilo civilizacijske številčnosti. Modelov zato ne obravnavamo kot pet ocen iste fizikalne količine, temveč kot pet generatorjev semantično različnih scenarijev.

Pri modelih I, II in IV je naravni izhod število neodvisnih aktivnih civilizacij N_{civ} . Pri naselitvenih modelih IIIA in IIIB-M razlikujemo med številom izvornih civilizacij N_{source} in številom aktivnih naseljenih lokacij N_{site} . Za primerjavo v skupnem supermodelnem prostoru uvedemo premostitveno diagnostično količino

$$N^*(m, s) = \begin{cases} N_{\text{civ}}^{(m,s)}, & m \in \{I, II, IV\}, \\ N_{\text{site}}^{(m,s)}, & m \in \{IIIA, IIIB-M\}, \end{cases} \quad (2)$$

kjer m označuje modelno komponento, s pa posamezni vzorec. Količina N^* omogoča skupni diagnostični prikaz, vendar ne pomeni fizikalne ali semantične enakovrednosti med neodvisnimi civilizacijami in naseljenimi lokacijami.

V supermodelu SM1 imajo vse modelne komponente enake uteži, $\pi_m = 0.2$. Za primerjavo treh supermodelnih utežnih scenarijev uporabimo poleg osnovnega supermodela SM1 še supermodela SM4 in SM5. Naj bo

$$\mathbf{a} = (a_I, a_{II}, a_{IIIA}, a_{IIIB-M}, a_{IV})$$

vektor utežnih kazni. Normalizirane mešalne koeficiente določimo kot

$$\pi_m = \frac{a_m^{-1}}{\sum_j a_j^{-1}}. \quad (3)$$

Za SM4 uporabimo $\mathbf{a} = (1, 1, 10, 10, 1)$, s čimer zmanjšamo relativni prispevek naselitvenih komponent, za SM5 pa $\mathbf{a} = (1, 1, 0.1, 0.1, 1)$, s čimer ga povečamo.

Za vsako od petih modelnih komponent smo enkrat generirali 120 000 veljavnih vzorcev negotovih parametrov iz omejenih porazdelitev, določenih z minimalno, modalno in maksimalno vrednostjo. Skupna zbirka tako vsebuje 600 000 vzorcev. Isto zbirko komponentnih vzorcev smo uporabili pri supermodelih SM1, SM4 in SM5; med njimi smo spreminjali samo mešalne koeficiente.

Uteži vzorcev znotraj posamezne komponente so normalizirane tako, da je njihova vsota enaka pripadajočemu koeficientu π_m . Takšna zasnova omogoča, da razlike med super modeli pripišemo spremembi uteži in ne neodvisni Monte Carlo variabilnosti.

Vzorci prikažemo v logaritmskem diagnostičnem prostoru

$$(\log_{10} L_{\text{active}}, \log_{10} N^*).$$

Gostoto ocenimo z uteženim dvodimenzionalnim histogramom z 90×90 celicami in jo zgladimo z Gaussovim jedrom s standardnim odklonom treh celic. Maksimum glajene gostote v obravnavanem območju označuje lokalno najgostejše območje prikazanega ansambla; ne enačimo ga z uteženim težiščem ali z empirično najverjetnejšim stanjem Galaksije.

Diagnostični prostor razdelimo na štiri disjunktne režime:

$$\begin{aligned} R_1 : L_{\text{active}} &< 10^3, \\ R_2 : 10^3 &\leq L_{\text{active}} < 10^5, \\ R_3 : L_{\text{active}} &\geq 10^5, \quad N^* < 10^2, \\ R_4 : L_{\text{active}} &\geq 10^5, \quad N^* \geq 10^2. \end{aligned} \quad (4)$$

Režimi tvorijo particijo veljavnega vzorčnega prostora, zato vsak vzorec pripada natanko enemu režimu. R_1 opisuje kratko aktivno življenjsko dobo, R_2 prehodno življenjsko dobo, R_3 dolgo življenjsko dobo z nizko diagnostično vrednostjo N^* , R_4 pa dolgo življenjsko dobo z visoko diagnostično vrednostjo N^* .

Pragovi so izbrani kot operativne meje po redih velikosti. Njihov namen je ločiti kratkožive, prehodne in dolgožive tehnološke scenarije ter pri dolgoživih scenarijih razlikovati med nizko in visoko diagnostično vrednostjo N^* . Ne predstavljajo empirično določenih prehodov ali naravnih civilizacijskih časovnih skal, temveč interpretativno particijo, namenjeno pregledni primerjavi različnih supermodelnih nastavitvev. Drugačna izbira pragov bi lahko spremenila posamezne režimske mase.

Uteženo maso režima R_k definiramo kot

$$p_k = \frac{\sum_{s=1}^n w_s \mathbf{1}_{R_k}(L_{\text{active}}^{(s)}, N^{*(s)})}{\sum_{s=1}^n w_s}, \quad (5)$$

kjer je w_s supermodelna utež vzorca, $\mathbf{1}_{R_k}$ pa indikatorska funkcija režima R_k . Ker so režimi disjunktne in izčrpni, velja $\sum_{k=1}^4 p_k = 1$.

3 Rezultati

V osnovnem enakomerno uteženem supermodelu SM1 največji delež simulacijskega ansambla pripada prehodnemu režimu R_2 , katerega utežena masa znaša 43.7%. Sledi dolgoživi režim z visoko diagnostično vrednostjo N^* , R_4 , z maso 35.9%. Kratkoživi režim R_1 vsebuje 12.9%, dolgoživi režim z nizko diagnostično vrednostjo N^* , R_3 , pa 7.5% skupne utežene mase. Režima R_2 in R_4 skupaj vsebujeta 79.6% utežene mase supermodela SM1.

Globalni maksimum glajene gostote se pojavi približno pri

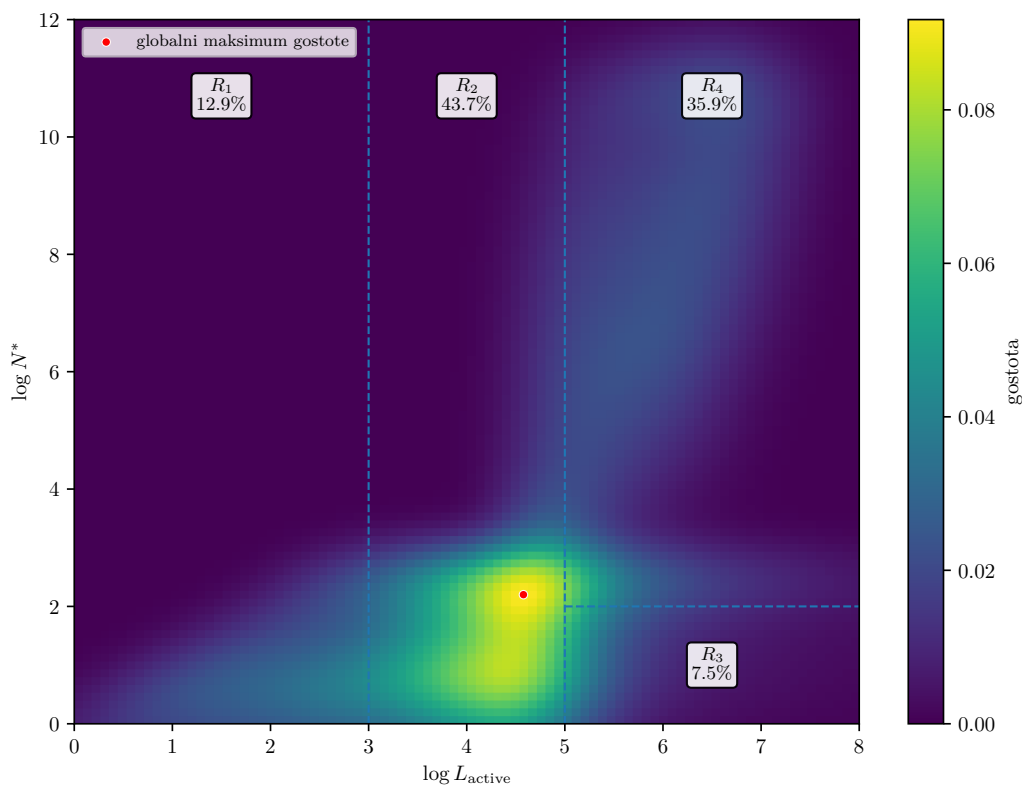
$$(\log_{10} L_{\text{active}}, \log_{10} N^*) \approx (4.58, 2.20),$$

kar ustreza

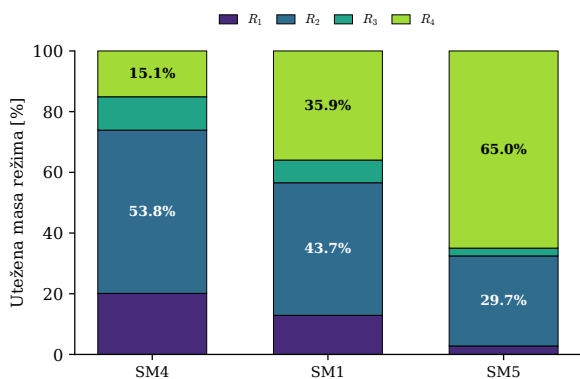
$$L_{\text{active}} \approx 3.8 \cdot 10^4 \text{ let}, \quad N^* \approx 1.6 \cdot 10^2.$$

Maksimum leži v režimu R_2 , ki je določen z intervalom aktivne življenjske dobe in ne postavlja dodatnega pogoja na diagnostično vrednost N^* .

Občutljivost režimske razdelitve smo preverili v treh nastavitvah supermodelnih uteži. V zaporedju SM4–SM1–SM5, v katerem se povečuje relativni prispevek naselitvenih komponent, masa režima R_4 naraste z 15.1% na 35.9% in nato na 65.0%. Hkrati masa režima R_2 pade s 53.8% na 43.7% in nato na 29.7%. V treh



Slika 1: Gostotna karta supermodela SM1 v diagnostičnem prostoru ($\log_{10} L_{\text{active}}$, $\log_{10} N^*$). Črčkane meje določajo štiri režime, oznake pa njihove utežene Monte Carlo mase. Rdeča točka označuje globalni maksimum glajene gostote.



Slika 2: Primerjava uteženih režimskih mas pri treh izbranih supermodelnih nastavitvah. Stolpci predstavljajo celotne režimske porazdelitve supermodelov SM4, SM1 in SM5. V zaporedju, v katerem se povečuje relativni prispevek naselitvenih komponent, se masa režima R_4 povečuje, masa režima R_2 pa zmanjšuje.

obravnavanih nastavitvah tako opazimo urejen premik režimske mase iz R_2 proti R_4 . Sprememba ne zadeva le enega režima, temveč preuredi celotno režimsko porazdelitev.

4 Razprava

Osrednje vprašanje te raziskave ni zgolj, kako dolgo lahko obstaja tehnološka civilizacija, temveč tudi, ali smo takšen civilizacijsko-kognitivni pojav sploh sposobni ustrezno razumeti. Človeška

kognicija je prilagojena razmišljanju v časovnih merilih posameznikovega življenja, družinskih generacij in zgodovinskih obdobjih, bistveno težje pa obravnava procese, ki trajajo tisoče, milijone ali celo milijarde let. Kot razvojna analogija lahko služi otroško razumevanje smrti. Pojmi njene univerzalnosti, nepovratnosti in osebne neizogibnosti se oblikujejo postopoma ter se praviloma utrdijo šele okoli zgodnjega šolskega obdobja. Spoznanje, da je posameznikovo življenje končno, je kognitivno in čustveno zahtevno. Podobno zahtevno je lahko tudi spoznanje, da človeška civilizacija ni nujno trajna, temveč ima lahko omejen časovni horizont obstoja.

V vsakdanjem, političnem in celo znanstvenem mišljenju človeško civilizacijo pogosto implicitno obravnavamo kot nadaljujoč se proces brez določenega konca. Razpravljamo o prihodnjih stoletjih, naseljevanju drugih planetov in tehnološkem napredku, ne da bi vedno eksplicitno upoštevali možnost, da je tudi tehnološka civilizacija prehodni pojav. Predstavljamo si lahko propad posameznih držav, kultur ali političnih ureditev, bistveno težje pa si predstavljamo dokončen konec celotne tehnološke civilizacije. Modeli, obravnavani v tem prispevku, to intuitivno predpostavko postavljajo pod vprašaj. Ne kažejo enega samega vnaprej določenega "roka trajanja", temveč scenarijski prostor, v katerem je večina civilizacijskih poti časovno omejena, zelo dolga življenjska doba pa ostaja mogoča, vendar pripada manjšemu in modelno občutljivejšemu delu prostora.

Rezultati kažejo, da osnovni supermodel SM1 največ utežene mase razporedi med prehodni režim R_2 in dolgoživi režim z visoko diagnostično vrednostjo N^* , R_4 . Teh deležev ne smemo razlagati kot neposrednih verjetnosti za dejansko Galaksijo. Gre za lastnosti scenarijskega prostora, ki ga določajo izbrane modelne enačbe,

vhodne porazdelitve, diagnostični pragovi in supermodelne uteži. Modeli zato ne dokazujejo, da bo človeška civilizacija prenehala obstajati ob določenem času, temveč formalizirajo spoznanje, da neskončno nadaljevanje tehnološke civilizacije ni privzeta posledica njenega nastanka.

Dominantnost režima R_2 poudarja razliko med nastankom tehnološke civilizacije in njeno dolgoročno stabilnostjo. V tem režimu tehnološka aktivnost preseže kratko začetno fazo, vendar še ne doseže časovne meje, ki smo jo diagnostično povezali z dolgoživo civilizacijsko prisotnostjo. Obstoj napredne tehnologije zato sam po sebi še ne pomeni dolgoročne civilizacijske stabilnosti. Civilizacija lahko razvije industrijo, globalne komunikacije, vesoljske tehnologije in umetno inteligenco, ne da bi s tem avtomatično rešila probleme politične nestabilnosti, ekoloških omejitev, tehnoloških tveganj, konfliktov ali izgube institucionalne sposobnosti za dolgoročno koordinacijo.

To razlikovanje je pomembno tudi pri razpravah o naseljevanju drugih planetov. Prostorska razširitev lahko bistveno zmanjša ranljivost civilizacije za lokalne katastrofe in v nekaterih modelnih scenarijih podaljša njeno skupno prisotnost za približno dva reda velikosti oziroma stokrat. Toda tudi večplanetarna civilizacija s tem ne postane nujno neomejena. Njena življenjska doba ostaja končna, kadar so kolonije medsebojno odvisne, kadar se iste sistemske napake reproducirajo na več lokacijah ali kadar dolgoročna tveganja delujejo na ravni celotne tehnološke kulture. Naseljevanje drugih planetov zato v obravnavanem modelnem okviru predstavlja podaljšanje civilizacijskega časovnega horizonta, ne pa odprave njegove končnosti.

Semantični pomen režimov R_3 in R_4 je odvisen od modelne komponente. Pri modelih I, II in IV visoka vrednost N^* pomeni veliko število neodvisnih aktivnih civilizacij. Pri naseljitvenih modelih IIIA in IIIB-M pa pomeni veliko število aktivnih naseljenih lokacij, ki lahko izvirajo iz ene ali nekaj izvornih civilizacij. R_4 je zato na ravni supermodela najprej režim dolge aktivne življenjske dobe in visoke diagnostične vrednosti. Interpretacijo v smislu prostorsko razširjene oziroma večplanetarne civilizacije ima le pogojno, znotraj naseljitvenih komponent.

Primerjava supermodelov dodatno pokaže, da režimska porazdelitev ni neodvisna od modelnih predpostavk. Ko v zaporedju SM4–SM1–SM5 povečujemo relativni prispevek naseljitvenih komponent, se masa R_4 povečuje, masa R_2 pa zmanjšuje. Pri naseljitvenih modelih to pomeni premik poudarka od časovne trajnosti ene tehnološke faze proti prostorski razpršenosti civilizacijske prisotnosti. Civilizacija lahko kot povezan politični ali kulturni sistem izgine, njene tehnološke naslednice ali naseljene lokacije pa lahko obstajajo še dolgo po tem. Pri drugih komponentah visoka vrednost N^* še vedno pomeni številčnost neodvisnih civilizacij, zato je treba spremembe režimskih mas vedno razlagati skupaj s sestavo supermodela.

Rare-Earth interpretacija je vzročno drugačna od režimske razdelitve. Nizka vrednost N^* lahko nastane zaradi kratke tehnološke življenjske dobe, lahko pa tudi zaradi redkosti planetarnih, geofizikalnih ali bioloških pogojev, potrebnih pred nastankom tehnološke inteligence. Enako območje diagnostičnega prostora ima zato lahko različne vzročne razlage, odvisno od modelne komponente, iz katere vzorec izvira. Galaksija z majhnim številom zaznavnih civilizacij je lahko Galaksija, v kateri tehnološke civilizacije pogosto nastanejo in hitro izginejo, ali pa Galaksija, v kateri je že njihov nastanek izjemno redek. Diagnostična podobnost zato ne pomeni nujno vzročne enakosti.

Poseben pomen ima majhna, vendar neničelna masa dolgoživih scenarijev. Modeli ne izključujejo možnosti, da tehnološka

civilizacija obstane izjemno dolgo. Takšni scenariji so manj zastopani, vendar kažejo, da kratka ali srednje dolga civilizacijska življenjska doba ni logična nujnost. Ključno vprašanje zato ni samo, kateri dejavniki povzročijo propad, temveč kateri mehanizmi bi civilizaciji omogočili prehod iz režima R_2 v režim R_4 . Tak prehod bi verjetno zahteval sposobnost napovedovanja dolgoročnih posledic, koordiniranja prek generacij, obvladovanja kompleksnih tehnoloških sistemov in omejevanja eksistencialnih tveganj v časovnih merilih, ki močno presegajo običajne človeške institucije.

V tem okviru se pojavi vprašanje superinteligence. Če so glavne omejitve civilizacijske dolgoživosti povezane s kompleksnostjo, kratkoročnostjo človeškega odločanja in nezmožnostjo zanesljivega upravljanja globalnih tveganj, potem bi prehod v skrajno dolgožive režime lahko zahteval kognitivne sposobnosti, ki presegajo posamezno in kolektivno človeško inteligenco. Superinteligence bi lahko omogočila boljše modeliranje dolgoročnih posledic, usklajevanje med sistemi, odkrivanje nevarnih razvojnih poti in vzdrževanje stabilnosti skozi zelo dolga obdobja. Vendar ista tehnologija predstavlja tudi potencialno eksistencialno tveganje. Superinteligence zato ne smemo obravnavati kot avtomatične rešitve, temveč kot možen prehodni mehanizem, katerega učinek je odvisen od usklajenosti ciljev, nadzora, institucionalnega okolja in sposobnosti človeštva, da varen prehod sploh izvede.

Osnovni paradoks je zato naslednji: civilizacija bi za dolgoročno preživetje morda potrebovala inteligenco, sposobno razumeti in upravljati procese, ki jih človeška kognicija sama težko zajame, ustvarjanje takšne inteligence pa je lahko eno največjih tveganj v njeni zgodovini. Majhna masa skrajno dolgoživih scenarijev se lahko zato interpretira kot ozko območje prehoda med dvema neuspehom: med nezmožnostjo preseči omejitve človeškega odločanja in nezmožnostjo varno upravljati sisteme, ki te omejitve presegajo. Ta interpretacija ni neposreden rezultat posamezne modelne enačbe, temveč hipoteza, ki izhaja iz povezave med modelnim scenarijskim prostorom in problemom civilizacijske kognicije.

Sliki v tem kontekstu opravljata komplementarni reprezentacijski funkciji. Gostotna karta eksternalizira skupno porazdelitev življenjske dobe in diagnostične vrednosti ter omogoča zaznavanje območij zgostitve, prehodov in skrajnih scenarijev. Zloženi stolpčni prikaz isti ansambel stisne v primerjavo režimskih mas med različnimi supermodelnimi predpostavkami. Režimska razdelitev tako podpira kategorizacijo kontinuiranega prostora v omejeno število interpretativnih enot, primerjava supermodelov pa naredi občutljivost rezultatov na predpostavke neposredno zaznavno [9, 10]. Gre za reprezentacijsko hipotezo, katere dejanski kognitivni učinek bi bilo treba preveriti z uporabniško študijo.

Ta reprezentacijska funkcija je pomembna prav zato, ker je civilizacijska dolgoživost težko predstavljen kognitivni objekt. Številka, izražena v letih, sama po sebi ne omogoča nujno razumevanja razlike med kratkoživim, prehodnim, večplanetarnim in skrajno dolgoživim scenarijem. Vizualna razdelitev prostora lahko končnost civilizacijskih poti naredi zaznavnejšo, hkrati pa preprečuje, da bi eno samo povprečje ali točkovno oceno napačno razumeli kot napoved. Namen prikazov zato ni le povzemanje rezultatov, temveč tudi podpora mišljenju o pojavu, ki presega intuitivna časovna merila človeškega odločanja.

Človeštvo je v tem okviru nepopolno opazovan primer tehnološke civilizacije. Njegova tehnološka zgodovina je prekratka, da bi ga lahko zanesljivo uvrstili v enega izmed režimov. Modeli zato ne napovedujejo njegove prihodnosti in ne določajo konkretnega

datuma njegovega konca. Omogočajo pa formalno ločevanje med več vprašanji: ali je glavno ozko grlo preživetje začetne tehnološke faze, dolgoročna politična in ekološka stabilnost, redkost predtehnoloških pogojev, sposobnost prostorskega širjenja ali prehod k oblikam inteligence, ki lahko upravljajo civilizacijo v zelo dolgih časovnih merilih.

Najpomembnejši rezultat zato morda ni ocena posamezne življenjske dobe, temveč sprememba perspektive. Civilizacije ni smiselno obravnavati kot neskončnega ozadja človeške zgodovine, temveč kot dinamičen, ranljiv in časovno omejen sistem. Večplanetarnost lahko njegovo življenje močno podaljša, vendar sama po sebi ne odpravi končnosti. Skrajno dolga civilizacijska prisotnost ostaja mogoča, vendar verjetno zahteva tehnološko, institucionalno in kognitivno preobrazbo. Temeljno vprašanje tako ni samo, koliko časa lahko živimo, ampak ali lahko dovolj zgodaj razumemo, da ima tudi civilizacija časovni horizont, ter razvijemo inteligenco in institucije, potrebne za njegovo podaljšanje.

5 Omejitve in prihodnje delo

Rezultate omejuje več metodoloških odločitev. Prvič, gostote karte in režimske mase so odvisne od izbranih intervalov parametrov, vzorčnih porazdelitev, diagnostičnih pragov in supermodelnih uteži. Vrednosti p_k zato niso posteriorne verjetnosti za dejansko Galaksijo, temveč lastnosti konkretnega simulacijskega ansambla. Enake uteži v SM1 predstavljajo primerjalno izhodišče, ne pa trditve, da je vseh pet modelnih komponent enako verjetnih.

Drugič, premostitvena količina N^* združuje semantično različne izhode. Pri nekaterih modelih predstavlja neodvisne aktivne civilizacije, pri naseljitvenih modelih pa aktivne naseljene lokacije. Skupni diagnostični prostor omogoča primerjavo, vendar ne odpravi razlike med N_{civ} in N_{site} . Režimske mase je zato treba interpretirati skupaj z modelno sestavo supermodela.

Tretjič, pragovi režimov R_1 – R_4 niso določeni kot naravne ali empirično potrjene meje. Izbrani so kot disjunktna diagnostična particija, ki omogoča pregledno primerjavo kratkoživih, prehodnih in dolgoživih scenarijev z nizko ali visoko vrednostjo N^* . Drugačna izbira pragov bi lahko spremenila posamezne režimske mase, položaj meja pa lahko vpliva tudi na interpretacijo prehoda med R_2 in R_4 .

Četrto, pri modelu IIIB-M verjetnost nezaznave uporabljamo kot diagnostični izhod, ne kot pogojno utež celotnega supermodelnega ansambla. Rezultatov zato ne smemo razlagati kot posteriorne porazdelitve, pogojene z dosedanjim neuspehom iskanja zunajzemeljskih signalov.

Petič, ocena, da lahko prostorska razširitev civilizacijsko prisotnost podaljša za približno dva reda velikosti, je odvisna od strukture naseljitvenih modelov. Ne vključuje nujno vseh oblik medplanetarne odvisnosti, skupnih tehnoloških ranljivosti, komunikacijskih zamikov, politične fragmentacije ali možnosti, da se iste nevarne razvojne poti ponovijo na več naseljenih lokacijah. Večplanetarnost zato v modelu ne sme biti enačena z zagotovljeno dolgoročno varnostjo.

Šestič, povezava med dolgoživimi režimi in superinteligenco je interpretativna hipoteza, ne neposredna napoved obravnavanih modelov. Modelne enačbe ne opisujejo podrobno nastanka, arhitekture, ciljev ali upravljanja naprednih sistemov umetne inteligence. Prav tako ne omogočajo sklepa, da je superinteligence nujen ali zadosten pogoj za prehod v R_4 . Omogočajo le vprašanje, ali bi reševanje problemov zelo dolgoročne koordinacije in

upravljanja tveganj lahko zahtevalo kognitivne zmogljivosti, ki presegajo obstoječe človeške sposobnosti.

Kognitivna interpretacija prav tako ostaja teoretično-metodološka. Prispevek grafična prikaza obravnava kot možni zunanji reprezentaciji scenarijskega prostora, vendar ne preverja, kako ju uporabniki dejansko razumejo, ali zmanjšujeta pristranskost k implicitni civilizacijski neskončnosti in ali izboljšujeta sklepanje v razmerah globoke negotovosti. Razvojna analogija z razumevanjem osebne umrljivosti je namenjena pojasnjevanju kognitivne težavnosti problema, ne pa enačenju individualne psihologije s procesi na ravni civilizacije.

Modeli poleg tega ne vključujejo podrobnih političnih, ekonomskih, ekoloških, vojaških, kulturnih in psiholoških procesov, ki bi določali prihodnost konkretne človeške civilizacije. Ne opisujejo niti možnih povratnih zank med tehnološkim napredkom, družbeno neenakostjo, institucionalno stabilnostjo, okoljskimi omejitvami in eksistencialnimi tveganji. Rezultati zato predstavljajo diagnostično strukturo scenarijskega prostora, ne celovitega modela prihodnosti človeštva.

Prihodnje delo naj preveri robustnost režimskih mas na spremembe vhodnih porazdelitev, diagnostičnih pragov in supermodelnih uteži. Ročno določene režime bi bilo mogoče primerjati s podatkovno dobljenimi območji, določenimi z gručenjem, segmentacijo gostotnih kart ali detekcijo lokalnih maksimumov. Interpretabilne metode strojnega učenja bi lahko izluščile pravila, ki povezujejo modelne parametre s pripadnostjo posameznemu režimu.

Naselitvene modele bi bilo smiselno razširiti z različnimi stopnjami neodvisnosti kolonij, hitrostmi širjenja, verjetnostmi lokalnega propada in skupnimi sistemskimi tveganji. Tako bi bilo mogoče natančneje razlikovati med civilizacijo, ki je zgolj prostorsko razširjena, in civilizacijo, katere lokacije so organizacijsko, tehnološko in ekološko dovolj neodvisne, da dejansko povečujejo njeno dolgoročno odpornost.

Posebna smer prihodnjega dela je vključitev prehodov med različnimi oblikami inteligence. Model bi lahko eksplicitno obravnaval scenarije, v katerih biološka tehnološka civilizacija razvije napredno umetno inteligenco, se z njo institucionalno poveže, jo neuspešno nadzira ali pa se preoblikuje v postbiološko civilizacijsko obliko. S tem bi bilo mogoče preveriti, ali takšni prehodi povečujejo maso dolgoživih režimov ali predvsem uvajajo novo zgodnjo fazo eksistencialnega tveganja.

Neposredno kognitivno validacijo bi omogočil uporabniški eksperiment, ki bi primerjal razumevanje negotovosti pri gostotni karti, zloženem stolpcnem prikazu, tabeli in enotni točkovni oceni. Preveriti bi bilo mogoče tudi, ali režimski prikazi vplivajo na sposobnost uporabnikov, da civilizacijo obravnavajo kot časovno omejen sistem, razlikujejo med verjetnostjo in modelno inducirano maso ter pravilno razumejo razliko med dolgoživostjo, večplanetarnostjo in številčnostjo neodvisnih civilizacij.

Končni cilj takšnega raziskovalnega programa ne bi bil določiti enega samega datuma konca človeške civilizacije. Njegov cilj bi bil razviti modele in reprezentacije, s katerimi lahko človeštvo razmišlja o lastni časovni omejenosti, prepozna mehanizme prehoda med kratkoživimi in dolgoživimi režimi ter oceni, katere tehnološke, institucionalne in kognitivne spremembe bi bile potrebne za bistveno podaljšanje civilizacijske prihodnosti.

6 Sklep

Prispevek obravnava Drake–Brin–Rare-Earth modele kot generatorje scenarijev in kot formalna sredstva za organizacijo sklepanja

pod globoko negotovostjo. Primerjalna količina N^* omogoča skupni prikaz semantično različnih modelnih izhodov in njihovo razdelitev na štiri režime.

V osnovnem supermodelu SM1 ima največjo uteženo maso prehodni režim R_2 , sledi dolgoživi režim z visoko diagnostično vrednostjo N^* , R_4 . V treh analiziranih supermodelnih nastavitvah se režimska porazdelitev sistematično odzove na relativni prispevek naselitvenih komponent, kar pokaže, da struktura scenarijskega prostora ni neodvisna od modelnih predpostavk.

Rezultati niso napoved prihodnosti človeštva in ne predstavljajo empiričnih verjetnosti za Galaksijo. Njihova vrednost je metodološka in reprezentacijska: kombinacija gostotne karte in primerjave režimskih mas pokaže, kako lahko semantična poravnava, Monte Carlo analiza in komplementarni grafični prikazi pretvorijo heterogen modelni ansambel v interpretabilen prostor možnih civilizacijskih scenarijev. Za konkretne kognitivne sklepe iz teh simulacijskih rezultatov pa potrebujemo dodatne analize.

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Digitalni socialni signali in oblikovanje mnenj: eksperimentalni dokazi iz spletnih okolij odločanja

Digital Social Signals and Opinion Formation: Experimental Evidence from Online Decision Environments

Brina Šerbec
Gimnazija Bežigrad
Ljubljana, Slovenija
brina.serbec@gmail.com

Maja Meško
Univerza v Mariboru, Fakulteta za organizacijske vede
Kranj, Slovenija
maja.mesko@um.si

Povzetek

V digitalnih okoljih so uporabniki pogosto izpostavljeni agregiranim socialnim signalom, kot so ocene, kazalniki priljubljenosti in prikazi večinskega mnenja. Takšni signali lahko vplivajo na presojo in odločanje tudi brez neposredne medosebne interakcije. V raziskavi smo preverjali, ali prikaz domnevnega povprečja odgovorov drugih vpliva na izražena stališča ter ali se ta učinek razlikuje glede na starost in samoocenjeno predznanje. V kvaziexperimentalni raziskavi je sodelovalo 456 oseb: 213 jih je izpolnilo kontrolno, 243 pa eksperimentalno različico spletnega vprašalnika. Udeleženci so na kontinuirani lestvici od 0 do 100 ocenili devet trditev s področij tehnologije, etike in osebnih vrednot. V eksperimentalni različici je bil pri vsaki trditvi prikazan domnevni povprečni odgovor prejšnjih udeležencev. Pri osmih od devetih postavk je bilo povprečje eksperimentalne skupine bližje prikazani vrednosti kakor povprečje kontrolne skupine; pri šestih postavkah je bila razlika statistično značilna. Učinek se ni statistično značilno razlikoval glede na starost ali samoocenjeno predznanje. Prikaz je bil povezan tudi s spremembami porazdelitve odgovorov: kadar je bil skladen z obstoječim soglasjem, se je koncentracija odgovorov povečala, kadar je bil z njim v nasprotju, pa se je porazdelitev bolj razpršila. Rezultati so skladni s teorijami informacijskega socialnega vpliva in agregacije mnenj ter so pomembni za načrtovanje spletnih platform, informacijskih sistemov in sistemov za podporo odločanju.

Ključne besede

informacijski socialni vpliv, oblikovanje mnenj, digitalne platforme, kolektivno odločanje, sistemi za podporo odločanju

Abstract

In digital environments, users are frequently exposed to aggregated social signals such as ratings, popularity indicators, and majority opinions. Such signals may influence judgment and decision-making even without direct interpersonal interaction. This study examined whether an alleged average of other participants' responses affects expressed attitudes and whether the effect varies by age and self-assessed prior knowledge. A quasi-experimental study was conducted with 456 participants who completed either a control ($n = 213$) or an experimental ($n = 243$) version of an online questionnaire. Participants evaluated nine statements concerning technology, ethics, and personal values on a continuous agreement scale from 0 to 100. In the experimental condition, each statement was accompanied by a graphical display of an alleged average response from previous participants. For eight of the nine items, the experimental-group mean was closer to the displayed value than the control-group mean; six between-group differences were statistically significant. The effect did not differ significantly by age or self-assessed prior knowledge. The displayed signal was also

associated with changes in response distributions: distributions became more concentrated when the signal was consistent with an existing consensus and more dispersed when it conflicted with that consensus. The findings are consistent with theories of informational social influence and opinion aggregation and have implications for the design of online platforms, information systems, recommendation interfaces, and decision-support systems.

Keywords

social influence, opinion formation, digital platforms, collective decision-making, information systems, informational social influence

1 Uvod

Digitalni vmesniki informacije pogosto umeščajo v družbeni kontekst. Izdelke, novice, zabavne vsebine in javne razprave spremljajo ocene, kazalniki priljubljenosti, število odzivov in oznake, kot je »večina uporabnikov se strinja«. Ti prikazi uporabnikom olajšajo orientacijo, hkrati pa še pred oblikovanjem samostojne presoje nakažejo, katero stališče prevladuje. Prikazano povprečje zato ne opisuje le odgovorov drugih, temveč lahko postane referenčna točka za naslednjega uporabnika. Ko se novi odgovori vključujejo v skupni prikaz, se lahko vzpostavi povratna zanka: socialni signal začne deloma soustvarjati mnenjski vzorec, ki naj bi ga zgolj prikazoval.

Oblikovanje mnenj ni zgolj individualni proces, temveč poteka v socialnem okolju. Kadar je vprašanje negotovo ali zahtevno, lahko posameznik mnenje drugih uporabi kot dodatno informacijo, saj domneva, da imajo drugi boljše ali popolnejše podatke. Tak informacijski socialni vpliv se razlikuje od normativnega vpliva, pri katerem se posameznik prilagodi predvsem zaradi želje po sprejetosti ali strahu pred zavrnitvijo [3, 5]. Klasični poskusi konformizma [1] so pokazali, da lahko mnenje večine spremeni izražene odgovore celo pri preprostih zaznavnih nalogah. V digitalnih okoljih podobno vlogo opravljajo povprečne ocene, število všečkov in prikazi večinskega stališča, čeprav neposredne skupinske interakcije ni.

Kelman [5] razlikuje tri oblike vpliva: prilagoditev zaradi pričakovanih nagrad ali kazni, identifikacijo, ki temelji na želji po pripadnosti, in ponotranjenje, pri katerem posameznik mnenje sprejme kot lastno. Ta razdelitev pojasnjuje, zakaj lahko zaznano družbeno soglasje spremeni izražen odgovor tudi brez neposrednega pritiska, ne pove pa nujno, kako trajna ali globoka je sprememba. Dovzetnost za socialni vpliv je lahko povezana tudi z razvojnimi in kognitivnimi dejavniki: mladostniki so v povprečju občutljivejši na mnenje vrstnikov [10], posamezniki z več znanja in večjim zaupanjem v lastno presojo pa naj bi bili odpornejši na zunanje informacije [8, 9]. Model verjetnosti poglobljene obdelave podobno predvideva, da imajo obrobni namigi večjo vlogo, kadar posameznik nima dovolj motivacije, znanja ali gotovosti za poglobljeno presojo [12]. Na tej podlagi smo starost in predznanje vključili kot možna moderatorja, pri čemer smo upoštevali, da samoocena znanja ni enaka objektivno izmerjeni kompetentnosti.

Formalni modeli oblikovanja mnenj to dinamiko opisujejo natančneje. DeGrootov model predpostavlja, da posamezniki svoja

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mnenja posodabljaajo z uteženim povprečenjem stališč oseb v svojem socialnem omrežju; pod določenimi pogoji se zato mnenja približujejo konsenzu [4]. Modeli omejenega zaupanja pa predvidevajo, da ljudje upoštevajo predvsem stališča, ki so dovolj blizu njihovim. Če je zunanji signal preveč oddaljen, ga lahko del posameznikov zavrne, zato se namesto enotnega soglasja ohrani več ločenih mnenjskih skupin [6]. Empirične raziskave kažejo, da lahko že opazovanje ocen drugih sistematično spremeni izražene presoje in vpliva na porazdelitev mnenj v skupini [9].

Cilj raziskave je bil preveriti štiri hipoteze: (H1) mlajši udeleženci bodo dovzetnejši za prikazani socialni signal kot starejši; (H2) učinek bo večji pri udeležencih z nižjim samoocenjenim predznanjem; (H3) povprečja eksperimentalne skupine bodo bližje prikazanemu povprečju kakor povprečja kontrolne skupine; (H4) kadar bo prikazana vrednost v nasprotju z začetnim soglasjem, se bo razpršenost odgovorov povečala.

2 Metoda

2.1 Udeleženci in načrt

V raziskavi je sodelovalo 456 oseb: 213 v kontrolni in 243 v eksperimentalni skupini. Slovenska in angleška različica vprašalnika sta bili med 1. 12. 2025 in 25. 2. 2026 posredovani dijakom Gimnazije Bežigrad ter objavljeni na družbenih omrežjih Facebook in Instagram. Udeležba je bila prostovoljna in anonimna. V obeh skupinah so prevladovali starejši dijaki, ženske pa so predstavljale 65,3 % kontrolne in 56,0 % eksperimentalne skupine, zato priložnostni vzorec ni demografsko reprezentativen. Raziskava je bila zasnovana kot kvaziekperiment z dvema neodvisnima skupinama. Neodvisna spremenljivka je bila prisotnost prikaza domnevnega povprečja prejšnjih odgovorov, odvisna spremenljivka pa stopnja strinjanja s posamezno trditvijo. Ker udeleženci niso bili naključno razporejeni med pogoja, je pri vzročni razlagi potrebna previdnost. Ker sta se vprašalnika razlikovala le po prikazu domnevnega povprečja, pa primerjava omogoča oceno povezanosti tega socialnega signala z odgovori.

2.2 Gradivo in postopek

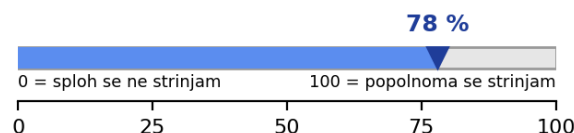
Obe skupini sta na kontinuirani lestvici od 0 (sploh se ne strinjam) do 100 (popolnoma se strinjam) ocenili devet trditev iz treh tematskih sklopov: vpliv tehnologije na vsakdan, etika in družbene dileme ter osebne odločitve in vrednote. Eksperimentalna skupina je ob vsaki trditvi videla še grafični prikaz domnevnega povprečja dosedanjih odgovorov (v analizah označen kot sidro; prikazane vrednosti od 11 % do 92 %; Slika 1, Tabela 1), kontrolna skupina pa je ocenjevala iste trditve brez tega podatka. Udeleženci so za vsak tematski sklop podali tudi samooceno poznavanja teme (dobro, srednje ali slabo).

Tabela 1: Devet trditev in prikazane povprečne vrednosti

Table 1: The nine statements and displayed average values

Vpr.	Trditev (skrajšano)	Prikaz (%)
V1	Uporabil/-a bi aplikacijo z umetno inteligenco, ki bi napovedala ujetje s partnerjem.	78 %
V2	Pripravljen/-a bi bil/-a živeti v popolnoma virtualnem okolju.	19 %
V3	Ljudem bi morali dovoliti tehnološke vsadke za povečanje kognitivnih sposobnosti.	11 %
V4	Izbral/-a bi vamo, povprečno plačano in nestresno življenje.	68 %
V5	Vsak ima pravico izražati svojo identiteto, tudi če je za večino nena vada.	15 %
V6	Če mi nekaj povzroča stres, je prav, da to preprosto opustim.	82 %
V7	Raje povem resnico, tudi če s tem nekoga prizadenem.	36 %
V8	Če nekdo ne spoštuje mojih vrednot, prekinem odnos.	25 %
V9	Sprejemni izpiti so pravičnejši način izbire kandidatov.	92 %

Opomba: V1–V3 – vpliv tehnologije; V4–V6 – etika in družbene dileme; V7–V9 – osebne odločitve in vrednote.



Slika 1: Rekonstrukcija prikaza domnevnega povprečja prejšnjih odgovorov (primer: 78 %)

Figure 1: Reconstruction of the alleged average response displayed to participants (example: 78%)

2.3 Analiza podatkov

Ali se učinek prikaza razlikuje glede na starost (H1) ali samoocenjeno predznanje (H2), smo preverili z dvofaktorsko analizo variance (skupina × starostna skupina oziroma skupina × predznanje); ključen je bil interakcijski člen. Povezanost med predznanjem in približevanjem prikazani vrednosti smo dodatno preverili s Spearmanovo korelacijo. H3 smo pri vsaki postavki posebej preverili z Welchovim t-testom, saj se je prikazana vrednost med postavkami razlikovala. P-vrednosti niso bile popravljene zaradi večkratnega testiranja. Pri H4 smo spremembe porazdelitev opisali z entropijo, modalnim deležem in številom lokalnih vrhov. Višja entropija pomeni večjo razpršenost, višji modalni delež pa večjo koncentracijo odgovorov; analiza H4 je bila zato predvsem opisna.

3 Rezultati

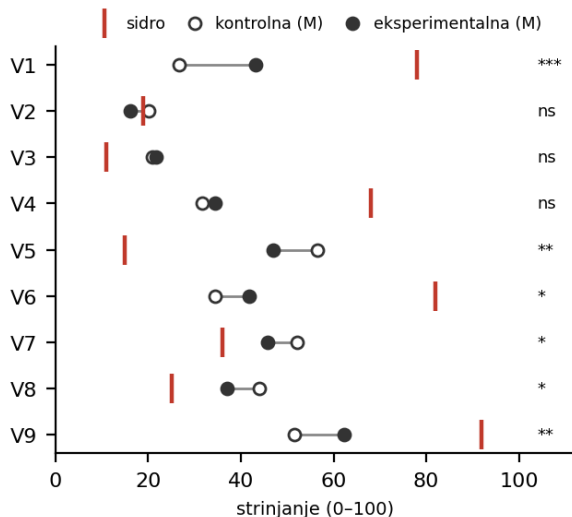
Vpliv prikazanega povprečja (H3). V podatkih se je najjasneje pokazalo približevanje prikazani vrednosti: pri osmih od devetih postavk je bilo povprečje eksperimentalne skupine bližje prikazanemu povprečju kakor povprečje kontrolne skupine, pri šestih postavkah pa je bila razlika statistično značilna (Tabela 2, Slika 2). Največja razlika med skupinama je bila pri V1 (+16,60 točke; $p < 0,001$), pri kateri je prikazana vrednost znašala 78 %. Pri visokih prikazanih vrednostih (V1, V6 in V9) so bila povprečja eksperimentalne skupine višja, pri nizkih (V5, V7 in V8) pa nižja. V3 je bila edina postavka, pri kateri povprečje eksperimentalne skupine ni bilo bližje prikazani vrednosti, vendar je bila razlika majhna in statistično neznačilna.

Tabela 2: Povprečni odgovori kontrolne in eksperimentalne skupine pri devetih postavkah

Table 2: Mean responses in the control and experimental groups across the nine items

Vpr.	Prikaz (%)	M kontrolna	M eksperim.	Razlika	Smer	p
V1	78	26,66	43,26	+16,60	✓	< 0,001
V2	19	20,18	16,05	−4,13	✓	0,095
V3	11	20,91	21,73	+0,82	X	0,773
V4	68	31,59	34,42	+2,83	✓	0,338
V5	15	56,47	47,02	−9,45	✓	0,010
V6	82	34,36	41,86	+7,50	✓	0,016
V7	36	52,04	45,81	−6,23	✓	0,044
V8	25	43,94	36,99	−6,95	✓	0,018
V9	92	51,61	62,35	+10,74	✓	0,002

Opomba: ✓ – povprečje eksperimentalne skupine je bližje prikazani vrednosti; X – povprečje je od nje bolj oddaljeno; M – aritmetična sredina odgovorov (0–100). P-vrednosti niso prilagojene za večkratno testiranje.



Slika 2: Povprečja kontrolne in eksperimentalne skupine ter prikazane vrednosti po postavkah

Figure 2: Control and experimental group means and displayed values by item (*** $p < .001$; ** $p < .01$; * $p < .05$; ns – not significant)

Starost (H1). Interakcija med skupino in starostno skupino ni bila statistično značilna ($p = 0,808$; $\eta^2 = 0,004$). Pri najštevilčnejših starostnih skupinah (15–17 in 18 let) so bile razlike med pogojeva majhne, rezultat najmlajše skupine (≤ 14 let) pa zaradi le petih udeležencev ni zanesljiv (Tabela 3). H1 zato ni bila podprta.

Tabela 3: Razlike med skupinami po starostnih kategorijah

Table 3: Between-group differences by age category

Starost	n eksp.	n kont.	Razlika	p
≤ 14	2	3	-22,8	0,055
15–17	104	98	+1,8	0,481
18	59	39	+1,0	0,797
19–30	67	23	+9,8	0,064
31+	11	39	+0,3	0,969

Opomba: Razlika – povprečje eksperimentalne skupine minus povprečje kontrolne skupine.

Samoocenjeno predznanje (H2). Približevanje prikazanemu povprečju je bilo opazno pri vseh ravneh predznanja, interakcija med skupino in predznanjem pa ni bila statistično značilna. Tudi Spearmanova korelacija med samoocenjenim predznanjem in približevanjem prikazani vrednosti je bila šibka in neznačilna ($r_s = -0,055$; $p = 0,167$), tako skupno kot po tematskih sklopih. Korelaciji pri V7 in V9, ki sta dosegli statistično značilnost, sta bili majhni in nista kazali enotne smeri, zato ne podpirata splošnega moderatorskega učinka. H2 ni bila podprta.

Struktura porazdelitve (H4). Sprememba porazdelitve odgovorov je bila odvisna od odnosa med prikazano vrednostjo in začetnim vzorcem odgovorov (Slika 3). Pri V1 in V5, kjer je bila prikazana vrednost v nasprotju s prevladujočim vzorcem v kontrolni skupini, se je entropija povečala (+0,33 oziroma +0,38), modalni delež pa zmanjšal (-0,213 oziroma -0,155), kar kaže na večjo razpršenost in oslabitev začetnega soglasja. Pri V2, kjer je bil prikaz skladen z začetnim soglasjem, se je entropija zmanjšala (-0,19), modalni delež pa povečal (+0,049). Pri V9, kjer izrazitega začetnega soglasja ni bilo, sta nižja entropija (-0,44) in višji modalni delež (+0,102) pokazala večjo koncentracijo odgovorov. Rezultati zato H4 podpirajo le delno: večja razpršenost se je pojavila predvsem takrat, ko je bil prikaz v nasprotju z začetnim mnenjskim vzorcem; v drugih primerih se je koncentracija odgovorov lahko povečala (Tabela 4).

Tabela 4: Izbrane spremembe porazdelitve odgovorov (eksperimentalna – kontrolna skupina)

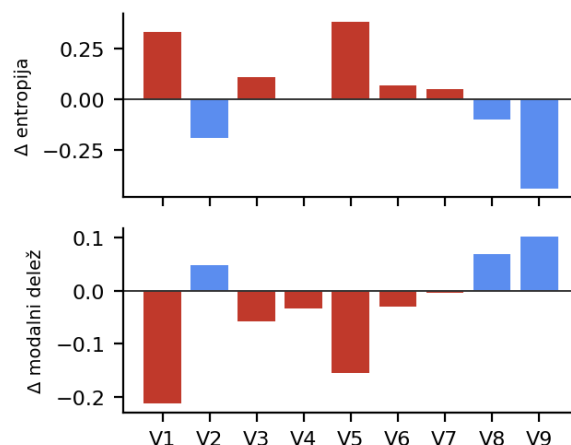
Table 4: Selected changes in response distributions (experimental – control group)

Vpr.	Δ entropije	Δ modalnega deleža	Razmerje do soglasja	Izid
V1	+0,33	-0,213	neskladje	razpršitev
V2	-0,19	+0,049	skladje	koncentracija
V5	+0,38	-0,155	neskladje	razpršitev
V9	-0,44	+0,102	brez soglasja	koncentracija

Opomba: Razmerje do soglasja opisuje odnos med prikazano vrednostjo in začetnim vzorcem odgovorov kontrolne skupine.

Slika 3: Sprememba entropije in modalnega deleža (eksperimentalna – kontrolna skupina)

Figure 3: Changes in entropy and modal share (experimental – control group)



Vsebinske razlike med postavkami. Največja absolutna razlika med skupinama se je pri V1 nanašala na uporabo aplikacije umetne inteligence za napoved ujemanja s partnerjem: povprečna ocena je bila v eksperimentalni skupini 43,26, v kontrolni pa 26,66, pri čemer je bila porazdelitev v eksperimentalni skupini bolj razpršena. Pri V9 (pravičnost sprejemnih izpitov) je bilo povprečje eksperimentalne skupine prav tako bližje visoki prikazani vrednosti, odgovori pa so bili bolj zgoščeni. Pri V5, V7 in V8, pri katerih so bile prikazane nizke vrednosti, so bila povprečja eksperimentalne skupine nižja od kontrolnih. V3 in V4 kažeta, da učinek ni bil enoten: razliki sta bili majhni, pri V3 pa je bilo povprečje celo nekoliko bolj oddaljeno od prikazane vrednosti. Ena od možnih razlag je večja utrjenost stališča ali psihološka reaktanca na zelo nizko prikazano vrednost, vendar tega v raziskavi nismo neposredno preverjali. Velikost razlike med skupinama je bila torej verjetno povezana tudi z vsebino postavke in oddaljenostjo prikazane vrednosti od začetnega mnenjskega vzorca.

4 Razprava

Rezultati so skladni z razlago informacijskega socialnega vpliva [2, 3]. Ker udeleženci niso bili v neposredni interakciji in niso bili izpostavljeni očitnemu skupinskemu pritisku, je bil normativni pritisk verjetno omejen. Kljub temu so bila povprečja eksperimentalne skupine pri osmih od devetih postavk bližje prikazanim vrednostim kakor povprečja kontrolne skupine. Tak vzorec je skladen z DeGrootovo zamislijo, da posameznik mnenje drugih vključi v lastno presojo kot dodaten vir informacij [4, 9]. Spremembe entropije in modalnega deleža dodatno kažejo, da prikaz ni bil povezan le z razlikami v povprečju: prikaz, skladen z začetnim vzorcem, je povečal koncentracijo odgovorov, nasprotujoč prikaz pa jo je pri V1 in V5 zmanjšal. Takšen vzorec je skladen s selektivno obravnavo neskladnih informacij [7] ter z modeli agregacije in omejenega zaupanja [6], manj pa s klasično skupinsko polarizacijo, ki navadno vključuje razpravo in izmenjavo argumentov [11]. Premik pri V5 je posebej zanimiv, saj kaže, da tudi javno izražena stališča o vrednotnih vprašanjih niso nujno neodvisna od zaznane družbene norme.

4.1 Starost in samoocenjeno znanje

Ker interakciji skupine s starostjo in samoocenjenim predznanjem nista bili statistično značilni, H1 in H2 nista bili podprti. To ne pomeni, da starost in znanje na splošno nista povezana z odpornostjo proti socialnemu vplivu [8, 10]. Starostne skupine so bile močno neuravnotežene, zato je bila statistična moč analiz omejena zlasti pri najmlajših in najstarejših udeležencih. Samoocena znanja poleg tega meri predvsem subjektivni občutek poznavanja teme, ki se lahko razlikuje od dejanske kompetentnosti [8]. Odsotnost statistično značilne moderacije je zato treba razumeti ozko: v tem vzorcu se učinek ni razlikoval glede na samooceno znanja, ne moremo pa sklepati, da je objektivna strokovnost nepomembna. V prihodnjih raziskavah bi bilo smiselno ločeno meriti dejansko znanje, gotovost pri posameznem odgovoru, osebno pomembnost teme in zaznano verodostojnost prikaza.

4.2 Pomen za digitalna okolja

Povprečne ocene, število odzivov in oznake »večina se strinja« uporabniku ne opisujejo le vedenja drugih, temveč sooblikujejo tudi okoliščine njegove presoje. Če sistem najprej prikaže agregat in šele nato zahteva oceno, lahko del opaženega soglasja nastane prav zaradi vrstnega reda prikaza. Tako se lahko vzpostavi povratna zanka: začetni, morda naključni ali manipulirani signal vpliva na nove odgovore, ti pa nato povečujejo njegovo navidezno verodostojnost. Pri načrtovanju platform bi bilo zato smiselno razmisliti o zbiranju prve ocene pred prikazom mnenja drugih, prikazu celotne porazdelitve namesto enega povprečja ter jasni navedbi velikosti in sestave vzorca. Pri vsebinah z večjimi posledicami bi lahko uporabnikom omogočili tudi skrivanje kazalnikov priljubljenosti ali pojasnili, kako je bil agregat izračunan. Takšni ukrepi ne bi preprečili koristnega socialnega učenja, lahko pa bi zmanjšali nekritično sledenje večini. Rezultat pri V5 si zasluži posebno pozornost: nizka prikazana vrednost je bila povezana z nižjim strinjanjem s trditvijo o pravici do izražanja nenavadne identitete, čeprav je bila kontrolna skupina razmeroma podporna. To ne dokazuje trajne spremembe moralnega prepričanja, kaže pa, da so javno izražena stališča o vrednotnih vprašanjih lahko občutljiva na zaznane norme. Kadar vidni odzivi sooblikujejo, kaj si uporabniki upajo izraziti, lahko metrike platform vplivajo tudi na ozračje javnega mnenja. Posebna previdnost je zato potrebna pri vrednotnih, zdravstvenih in političnih vsebinah, kjer lahko agregirani kazalniki ustvarijo vtis, da je prevladujoče stališče tudi pravilno.

4.3 Omejitve in nadaljnje raziskave

Možnost posploševanja rezultatov omejujejo nerandomizirana razporeditev med pogoja, pridobivanje udeležencev prek ene šole in družbenih omrežij, nereprezentativna starostna in spolna sestava vzorca ter uporaba samoocene namesto objektivnega merila znanja. Raziskava je merila trenutno izražena stališča, ne njihove trajnosti ali ponotranjenja [5]. Prav tako nismo neposredno preverili, ali so udeleženci prikazanim povprečjem verjeli. Devet vsebinsko različnih postavk omogoča primerjavo več področij, vendar vsako področje zastopa le malo postavk, zato ugotovitev ni mogoče preprosto posplošiti na vse tehnološke, etične ali vrednotne presoje. Metodološko strožja nadaljnja raziskava bi udeležence naključno razporedila med pogoje, izmerila njihova izhodiščna mnenja, sistematično spreminjala oddaljenost in verodostojnost prikaza ter vključila objektivno merilo znanja in gotovost pri posameznem odgovoru. Zakasnjeno ponovno merjenje bi pomagalo razlikovati med začasnim sidranjem in trajnejšo spremembo stališča, zaporedni eksperimenti, v katerih odgovori ene skupine določijo prikaz za naslednjo, pa bi omogočili neposredno preučevanje povratnih zank.

5 Zaključek

Pri osmih od devetih postavk je bilo povprečje eksperimentalne skupine bližje prikazani vrednosti kakor povprečje kontrolne skupine, pri šestih postavkah pa je bila razlika statistično značilna. Učinek se ni statistično značilno razlikoval glede na starost ali samoocenjeno predznanje. Povezava med prikazano vrednostjo in porazdelitvijo odgovorov ni bila enotna: kadar je bil prikaz skladen z začetnim mnenjskim vzorcem, se je koncentracija odgovorov

povečala, kadar je bil z njim v nasprotju, pa se je porazdelitev lahko bolj razpršila.

Raziskava nadgrajuje obstoječe razumevanje oblikovanja mnenj v digitalnih okoljih z empiričnimi eksperimentalnimi dokazi o vplivu agregirane socialne povratne informacije. Poleg tega analizira starost in samoocenjeno znanje kot možna moderatorja tega vpliva ter pokaže, da digitalni socialni signali vplivajo ne le na povprečno izražena stališča, temveč tudi na širšo strukturo in koncentracijo porazdelitve mnenj. Agregirana socialna povratna informacija zato ni zgolj opisna; v digitalnih okoljih odločanja lahko postane aktiven dejavnik oblikovanja javno izraženih mnenj. To spoznanje je pomembno tako za teorije socialnega vpliva kot za odgovorno načrtovanje informacijskih sistemov, priporočilnih vmesnikov in sistemov za podporo odločanju.

Zahvala

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Quantifying the Relationship Between Cognitive Performance and Consciousness Based on IIT-Proxy Approach Across 15 Species

Primož Kocuvan
primoz.kocuvan@ijs.si
Jožef Stefan Institute
Ljubljana, Slovenia

Matjaž Gams
matjaz.gams@ijs.si
Jožef Stefan Institute
Ljubljana, Slovenia

Abstract

The relationship between intelligence and consciousness remains an open question across cognitive science, neuroscience, and artificial intelligence. This study explores a comparative scoring framework across 15 selected species. A cognitive-evidence index combines behavioral-test outcomes, tool use, and neuron-count categories, while a separate heuristic profile organizes comparative descriptions under five IIT-inspired dimensions, with large language models serving as analytical aids. Pearson and Spearman correlations indicate a positive association between the resulting indices. However, the cognitive index is not a validated measure of general intelligence, the IIT-inspired profile is not a direct measurement of consciousness or integrated information, and the two indices draw partly on overlapping evidence. The findings therefore describe exploratory concordance within the proposed scoring framework rather than an independently established relationship between intelligence and consciousness.

Keywords

cognitive performance, large language models, consciousness, intelligence, IIT

1 Introduction

The relationship between intelligence and consciousness is a fundamental but unresolved question in cognitive science, neuroscience, philosophy of mind, and artificial intelligence. Intelligence is generally associated with the capacity to learn, solve problems, adapt to changing conditions, and use information to achieve goals. Consciousness, by contrast, refers to the presence and organization of subjective experience. Although these capacities often appear together in humans and other animals, they are conceptually distinct, and their relationship cannot be assumed to be direct or causal.

Comparative research across species provides a useful framework for examining this relationship. Animals differ substantially in memory, behavioral flexibility, self-related processing, inhibitory control, tool use, and problem-solving ability. However, no single behavioral task provides a complete or species-neutral measure of intelligence, because performance may depend on sensory abilities, motivation, ecological specialization, prior experience, and experimental design. Brain size and neuron count indicate the biological resources available for information processing, but cognitive performance also depends on neural

organization, connectivity, functional specialization, recurrent interactions, and information integration. Cognitive capacity is therefore better evaluated through a combination of behavioral and neurobiological indicators rather than biological scale alone.

The assessment of consciousness presents an even greater methodological challenge because subjective experience cannot be directly observed from an external perspective. Behavioral complexity may indicate advanced information processing, but it does not establish the presence, content, or degree of conscious experience. Comparative investigation therefore requires an explicit theoretical framework that identifies properties relevant to consciousness and translates them into criteria that can be evaluated using available evidence.

Integrated Information Theory provides one possible framework for such an analysis. It characterizes conscious experience. These properties correspond to the theory's phenomenological axioms. The theory emphasizes that consciousness depends not simply on the amount of processing performed by a system, but on how its elements form an integrated causal structure. Direct calculation of integrated information for the whole brains of different species is currently impractical because it would require detailed knowledge of their complete causal organization. Theory-informed proxy assessments can instead provide a structured means of examining how behavioral and neurobiological evidence corresponds to selected properties of conscious processing. Such assessments are not direct measurements of consciousness or formal calculations of integrated information. Large language models may assist in organizing heterogeneous evidence.

2 Related work

A broad scoping review identifies dozens of competing theories of consciousness, highlighting persistent disagreement over definitions, mechanisms, and explanatory scope [1, 2]. Research on neural correlates of consciousness (NCC) has identified candidate mechanisms associated with conscious perception, but their interpretation remains contested, complicating efforts to relate subjective experience to intelligent behavior [3]. In neuroscience and cognitive science, Global Workspace Theory (GWT) proposes that consciousness arises when information is globally broadcast across distributed systems, enabling flexible integration, cognitive control, reportable awareness, and coordination among otherwise modular processes [4]. Supporting evidence emphasizes recurrent processing and large-scale cortical integration, although GWT's neural implementation and explanatory sufficiency remain debated [5]. Higher-order theories (HOT) hold that conscious states require higher-order representations of lower-order mental states, linking awareness to metacognitive or representational capacity [6]; predictive-processing and re-entrant theories instead emphasize top-down and bottom-up interactions

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that minimize prediction error and connect consciousness with attention and intelligence. By contrast, Integrated Information Theory (IIT) defines consciousness in terms of integrated causal structure, quantified by the informational measure Φ , and allows consciousness to dissociate from behavioral sophistication [7]. Recent adversarial and comparative studies have directly contrasted GWT-, HOT-, and IIT-based predictions, sharpening their differences while leaving the mechanisms of consciousness unresolved [8, 9].

Alongside these competing accounts, integrative perspectives seek to reconcile global broadcasting, predictive processing, attention schema approaches, and internal world-modeling, suggesting that consciousness and intelligence may rely on overlapping enabling mechanisms without standing in a simple identity relation [10, 5]. Although intelligent behavior can clearly occur without conscious awareness, many researchers agree that, in biological systems, consciousness often complements advanced cognition by supporting flexible integration, self-monitoring, and adaptive control, even as the precise relationship remains unresolved [5].

3 Methodology

According to Integrated Information Theory (IIT), as developed by Tononi and colleagues, consciousness is grounded in a set of phenomenological axioms—fundamental properties that every conscious experience must satisfy. These axioms are intended to be self-evident features of subjective experience itself and serve as the conceptual basis for corresponding physical postulates that a system must satisfy in order to be conscious. We distinguish intelligence as a broad capacity for learning, problem solving, and adaptation from the cognitive score used in this study. The latter is an operational index combining selected behavioral findings with a coarse indicator of neural resources. It therefore represents evidence relevant to some aspects of intelligence, rather than intelligence itself or a validated measure of general intelligence across species. Accordingly, a higher cognitive score indicates a higher aggregate score on the selected indicators; it does not imply a proportionally greater level of intelligence. The five axioms of IIT are as follows:

- **Intrinsic existence:** Conscious experience exists for itself. It is intrinsic to the experiencing subject and does not depend on observation by an external entity.
- **Information:** Every conscious experience is specific and differentiated; it is defined by being this particular experience rather than any of the many other possible experiences.
- **Integration:** Conscious experience is unitary and irreducible. It cannot be decomposed into independent components without losing the experience as a whole.
- **Exclusion:** Conscious experience is definite in both content and spatiotemporal extent. At any given moment, there is a single, determinate experience rather than multiple overlapping ones.
- **Composition:** Conscious experience is structured, consisting of multiple distinctions and relations that together form a unified experiential whole.

The IIT axioms describe properties of experience, whereas the corresponding physical postulates concern the causal organization of the substrate supporting that experience [11, 12]. Behavioral capacities are therefore not equivalent to the axioms. In this

study, the axiom names provide an organizing framework for a heuristic comparative assessment, rather than independently measurable behavioral criteria.

The proposed connection is conceptual: information motivates attention to differentiated processing, integration to the coordination of information, and composition to structured relations among represented contents. Descriptions of behavioral flexibility, neural organization, and complex cognition can inform such a comparison, but they do not establish intrinsic information, causal irreducibility, or the causal structure required by IIT. Thus, these descriptions provide interpretive context rather than direct measurements of the corresponding postulates.

Two distinctions are especially important. Intrinsic existence does not mean reflective self-recognition: mirror-test performance does not establish that a system has intrinsic cause–effect power. Likewise, exclusion concerns the definite boundary and spatiotemporal grain of a conscious substrate, not inhibitory control or the selection of a single behavioral response. The behavioral tests included here do not directly assess either property.

Accordingly, self-recognition, theory of mind, metacognition, and language are considered aspects of the comparative evidence, not necessary or sufficient criteria for consciousness. The numerical ratings are IIT-inspired heuristic judgments, not measurements of how strongly an axiom is satisfied or calculations of Φ . LLMs served as analytical aids in this qualitative assessment, not as independent measurements of consciousness.

For each species, the three behavioral-test outcomes were scored as 2 for a clear pass, 1 for a partial or conditional pass, and 0 for a failed test or a test that had not been conducted. Tool use was scored as 2 for confirmed use, 1 for partial or limited evidence, and 0 for no documented evidence. Neuron counts were assigned to five ordered categories, from 0 for very low to 4 for very high, using the ranges specified in Table 2.

The difference in scale resolution reflects the distinction between categorical behavioral evidence and categorized numerical neuron-count estimates. Three levels capture the coarse evidence distinctions reported for behavioral tests and tool use, whereas five neuron-count categories retain a broader ordering of neural resources. These are pragmatic ordinal coding conventions, not empirically calibrated units of cognitive ability.

The cognitive score was calculated as

$$C_i = M_i + O_i + D_i + T_i + N_i,$$

where M_i , O_i , and D_i denote the mirror, novel-object-recognition, and delay-of-gratification scores, respectively, T_i denotes tool use, and N_i denotes the neuron-count category. Consequently, neuron count has twice the maximum point contribution of any individual behavioral component. This unequal contribution is a consequence of the chosen coding scheme, not an empirically established weighting of biological importance. Furthermore, assigning zero to an untested case indicates an absence of credited positive evidence, not demonstrated inability, making the index sensitive to differences in research coverage.

Separately, the five IIT-inspired proxy dimensions were each rated on a 1–10 scale and summed, giving a possible total of 5–50 (Table 1). To examine the association between the cognitive score and the IIT-inspired proxy total, we used Pearson's correlation coefficient (ρ) and Spearman's rank correlation coefficient (ρ_s).

$$\rho = \frac{\sum_{i=1}^n (x_i - \bar{x})(y_i - \bar{y})}{\sqrt{\sum_{i=1}^n (x_i - \bar{x})^2} \sqrt{\sum_{i=1}^n (y_i - \bar{y})^2}},$$

$$\rho_s = \frac{\sum_{i=1}^n (R[X_i] - \overline{R[X]})(R[Y_i] - \overline{R[Y]})}{\sqrt{\sum_{i=1}^n (R[X_i] - \overline{R[X]})^2} \sqrt{\sum_{i=1}^n (R[Y_i] - \overline{R[Y]})^2}},$$

The two indices were constructed using partly overlapping evidence. The cognitive score assigns explicit points to behavioral-test outcomes, tool use, and neuron-count categories, whereas the IIT-inspired profile uses qualitative judgments informed by some of the same behavioral and neurobiological descriptions. For example, mirror-test evidence contributes to the cognitive score and also informs the discussion of self-recognition used in the proxy assessment. Neuron count enters the cognitive score directly and was also considered as contextual neurobiological information in the qualitative comparison.

The different scoring procedures therefore do not make the underlying evidence independent. Shared evidence may contribute to a positive association between the indices, although it does not mathematically determine the sign or magnitude of the resulting correlation. The analysis consequently evaluates agreement between partially dependent constructed indices, rather than an independent association between measured intelligence and measured consciousness.

4 Results

We calculated the scores with $n = 15$ species included in the comparison. The two scores showed a strong positive association across species:

$$\rho = 0.802, \quad \rho_s = 0.792.$$

The Pearson correlation indicates a strong approximately linear relationship between the two variables: species with higher intelligence/cognitive-test scores tended to also have higher Tononi style proxy scores. The squared Pearson correlation is:

$$r^2 = 0.802^2 \approx 0.643,$$

which means that approximately 64% of the variance in the Tononi/IIT-style proxy score is associated with the linear variation in the intelligence/cognitive score. This should be interpreted as statistical association, not as a causal explanation.

The Spearman rank correlation was similarly high; this indicates that the rank ordering of species was also broadly consistent between the two scoring systems. In other words, species ranked highly by cognitive-test evidence also tended to rank highly by the IIT-inspired axiom profile.

Overall, the results indicate concordance between the cognitive score and the IIT-inspired heuristic profile under the selected scoring scheme. However, their partly shared evidence base means that this concordance is not an independent validation of either index. The present analysis does not separate the contribution of shared scoring evidence from any association between the underlying constructs. Similar Pearson and Spearman coefficients do not resolve this dependence. The findings should

therefore be interpreted as exploratory agreement between constructed indices, not as evidence that intelligence determines consciousness or that the proxy total measures subjective experience.

A further limitation is that species are not statistically independent data points, because closely related species share evolutionary history. Therefore, the correlation is useful as an exploratory comparison, but a stronger comparative analysis would require phylogenetic correction and independently measured neurobiological variables.

The proxy scores in Table 1 were assigned through a two-step heuristic comparison. Human ratings were fixed at 10 for each dimension, giving a total of 50, and chimpanzee ratings were assigned a total of 30, equivalent to a mean of 6 across the five dimensions. These values are reference points within the scoring scheme, not experimentally established percentages of consciousness or integrated information.

The remaining species were positioned relative to these anchors using comparative descriptions of self-related processing, behavioral flexibility, neural organization, and cognitive performance. Such evidence informs the qualitative comparison but does not provide an independently validated conversion into numerical consciousness scores. In particular, a chimpanzee total of 30 relative to a human total of 50 does not establish that chimpanzees possess 60% of human consciousness. Numerical distances between species represent heuristic assignments rather than calibrated differences in subjective experience.

5 Future Work

Several directions for future research follow naturally from the present study. First, the proposed scoring framework for intelligence and consciousness should be refined by incorporating more fine-grained, empirically grounded measures. To explore alternative operationalizations of consciousness derived from competing theoretical frameworks beyond Integrated Information Theory, such as Global Neuronal Workspace or higher-order models. Second, the methodological dependence on large language models as analytical aids warrants systematic evaluation. Future studies should assess the sensitivity of the results to model choice, prompting strategy, and training data, as well as examine inter-model and inter-rater reliability when LLM-assisted assessments are compared with expert human judgments. This would help clarify the extent to which the observed correlations reflect underlying biological patterns rather than artifacts of linguistic or conceptual overlap. Third, the present analysis could be extended to a broader and more diverse set of biological species. Future work should explore alternative statistical analyses and robustness checks, including sensitivity analyses under different scoring scales, partial correlations controlling for neural or morphological variables, and longitudinal or developmental comparisons where data permit. Such extensions would strengthen the interpretability of the results and contribute to a more nuanced understanding of the relationship between intelligence and consciousness across natural systems.

A priority is to document evidence overlap at the level of individual scoring decisions and repeat the analysis using non-overlapping evidence sets. Independent assessors should assign proxy ratings without access to the cognitive totals, although blinding alone would not remove dependence if the underlying evidence remained shared. Sensitivity analyses should also examine alternative component weights, the treatment of untested

Table 1: IIT-inspired heuristic proxy profiles across selected species. Each proxy dimension is rated on a 1–10 scale, and the total is the sum of the five ratings. The dimension names refer to IIT-inspired interpretive categories, not direct tests of the axioms or calculations of Φ .

Species	Intrinsicality	Information	Integration	Exclusion	Composition	Sum
Human (<i>Homo sapiens</i>)	10.0	10.0	10.0	10.0	10.0	50.0
Chimpanzee (<i>Pan troglodytes</i>)	7.5	7.0	5.5	5.0	5.0	30.0
Bonobo (<i>Pan paniscus</i>)	7.3	6.8	5.3	4.8	4.8	29.0
Orangutan (<i>Pongo</i>)	7.2	6.7	5.2	4.7	4.7	28.5
Bottlenose dolphin (<i>Tursiops truncatus</i>)	7.0	6.5	5.0	4.5	4.5	27.5
Gorilla (<i>Gorilla gorilla</i>)	6.9	6.4	4.9	4.4	4.4	27.0
African elephant (<i>Loxodonta africana</i>)	6.6	6.1	4.6	4.1	4.1	25.5
Raven (<i>Corvus corax</i>)	5.8	5.5	4.2	3.7	3.8	23.0
African grey parrot (<i>Psittacus erithacus</i>)	5.6	5.3	4.0	3.5	3.6	22.0
Dog (<i>Canis familiaris</i>)	5.2	4.9	3.7	3.2	3.5	20.5
Cat (<i>Felis catus</i>)	4.7	4.4	3.3	2.8	3.3	18.5
Sheep (<i>Ovis aries</i>)	4.3	4.0	3.0	2.5	2.7	16.5
Rat (<i>Rattus norvegicus</i>)	3.6	3.4	2.5	2.0	2.5	14.0
Mouse (<i>Mus musculus</i>)	3.3	3.1	2.3	1.8	2.0	12.5
Rabbit (<i>Oryctolagus cuniculus</i>)	3.1	2.9	2.1	1.6	1.8	11.5

Scoring note. The ratings are heuristic comparative judgments, not calibrated measurements of consciousness. Human ratings are fixed at 10 for each dimension, giving a total of 50. Chimpanzee ratings sum to 30, corresponding to a mean of 6. These anchors are reference conventions within the scoring scheme.

cases as missing rather than zero, and the influence of the human and chimpanzee reference anchors.

A further methodological objective is to make the translation from theoretical concepts to proxy ratings explicit and reproducible. For each IIT-inspired dimension, future studies should specify the corresponding physical postulate, the empirical indicator proposed to approximate it, the supporting evidence, and the rule for assigning a numerical rating. Each proposed correspondence should be treated as a hypothesis requiring validation, rather than as an equivalence between a behavioral capacity and an IIT axiom. Where no defensible empirical indicator is available, the dimension should be reported as unassessed rather than inferred solely from general cognitive sophistication. Reporting dimension-specific profiles alongside aggregate totals would also allow researchers to examine whether summation obscures distinct patterns of capacities. This approach would make it possible to evaluate individual proxy dimensions separately, without assuming that all dimensions have equal empirical support.

Future comparative datasets should also prioritize the comparability and quality of evidence across species, rather than relying only on a larger species count. Behavioral tasks should accommodate species-specific sensory, motor, and ecological characteristics while retaining an explicitly defined cognitive target. The evidence base should distinguish direct species-specific observations from numerical estimates and findings extrapolated from related species, with uncertainty in these inputs propagated to the resulting scores and correlations. With a sufficiently broad sample, phylogenetically informed analyses could examine whether the association persists after accounting for shared evolutionary history, while leave-one-species-out analyses could assess its dependence on individual species. These checks would complement, rather than replace, the separation of evidence used to construct the two indices and would help establish the conditions under which the proposed comparative framework yields stable and interpretable results.

6 Conclusion

This study compared a cognitive-evidence index with an IIT-inspired heuristic profile across 15 selected species. Using comparative behavioral and neurobiological descriptions, with large

language models as analytical aids, the analysis identified a positive association between the two constructed indices.

The interpretation is limited by the heuristic scoring scales, the selected reference anchors, and the partly overlapping evidence used in constructing the indices. The cognitive score should not be equated with general intelligence, and the IIT-inspired total should not be interpreted as a measured degree of consciousness or a calculation of Φ . Agreement between Pearson and Spearman coefficients describes the observed association but does not establish independence from these methodological choices.

The contribution is therefore an exploratory framework for organizing comparative evidence and making its assumptions explicit. Establishing whether a corresponding association persists beyond shared scoring information requires independently operationalized indicators, transparent evidence-to-score rules, and sensitivity analyses.

More broadly, the study highlights a methodological distinction between the evidence available for a species, the theoretical interpretation of that evidence, and the numerical representation chosen for comparison. Within the present framework, a behavioral finding contributes an observation, its relevance to an IIT-inspired dimension requires an interpretive argument, and its translation into a rating introduces a further modeling choice. Keeping these steps separate is essential for preventing apparent numerical precision from being mistaken for direct access to subjective experience. It also clarifies the role of LLMs: they may support the organization and synthesis of comparative descriptions, but the justification of a proxy remains dependent on the evidence and assumptions underlying it, rather than on the fluency or consistency of the generated assessment. The proposed comparison should therefore be used to formulate questions about the relationship between cognitive capacities and consciousness-related properties, not to establish a definitive hierarchy of conscious experience. In particular, the framework can help identify which proposed relationships warrant independent investigation and where the available evidence is insufficient to support a numerical distinction. Disagreement between indicators or between alternative interpretations should be retained as an informative feature of the comparison rather than resolved solely to produce consistent aggregate scores.

Table 2: Comparison of selected cognition-related findings across species.

Species	Mirror Test	Novel Object Recognition Test	Marshmallow / delay-of-gratification test	Tool use	Total brain neurons
Mouse (<i>Mus musculus</i>)	Passed, conditional [13]	Passed [14]	Passed [15]	Yes; proto-tool / string-pulling evidence [16]	Very low; approx. 71 million total brain neurons [17, 18]
Rat (<i>Rattus norvegicus</i>)	Not conducted / not found as formal visual mark test [19]	Passed [20]	Passed [21]	Yes; rake/tool-retrieval task [22]	Low; approx. 200 million total brain neurons [17]
Rabbit (<i>Oryctolagus cuniculus</i>)	Not conducted / not found as formal mark test [23]	Passed [24]	Not conducted / not found [25]	Not conducted / not found [26]	Low; approx. 494 million total brain neurons [18]
Cat (<i>Felis catus</i>)	Not conducted / not found as formal mark test [27]	Passed [28]	Not conducted / not found [25]	Yes; proto-tool / string-pulling evidence [29]	Middle; approx. 1.215 billion total brain neurons [30]
Dog (<i>Canis familiaris</i>)	Not passed in classic visual mirror test [31]	Passed in adapted toy/NOR task [32]	Passed, variable performance [33]	Yes; proto-tool / string-pulling evidence [34]	Middle; approx. 2.253 billion total brain neurons [30]
Sheep (<i>Ovis aries</i>)	Not conducted / not found as formal mark test [35]	Not conducted / not found as formal NOR memory test [36]	Passed [37]	Not conducted / not found [38]	Middle; approx. 3.7–3.9 billion total brain neurons, estimated from sheep brain mass and arctodactyl scaling [39, 40]
Chimpanzee (<i>Pan troglodytes</i>)	Passed [31]	Passed, conditional / great-ape group-level evidence [41]	Passed [42]	Yes; strong natural tool-use evidence [43]	High; approx. 28 billion total brain neurons [44]
Bonobo (<i>Pan paniscus</i>)	Passed, but less robust than chimpanzee/orangutan evidence [31]	Passed, conditional / great-ape group-level evidence [41]	Passed [45, 46]	Yes; rare wild evidence and stronger captive evidence [47]	High; approx. 25–29 billion total brain neurons, estimated from chimpanzee/great-ape scaling [44]
Gorilla (<i>Gorilla gorilla</i>)	Mixed / conditional; not a clean pass [31]	Passed, conditional / great-ape group-level evidence [41]	Passed, conditional / mixed [46]	Yes; rare natural evidence [48]	Very high; approx. 33.4 billion total brain neurons [44, 49]
Orangutan (<i>Pongo</i>)	Passed [31]	Passed, conditional / great-ape group-level evidence [41]	Passed [50]	Yes; strong natural evidence [51]	Very high; approx. 32.6 billion total brain neurons [44, 49]
Human (<i>Homo sapiens</i>)	Passed [31]	Passed in human analogue / visual-paired-comparison tasks [52]	Passed, with individual variation [53]	Yes; unequivocal archaeological and modern evidence [54]	Very high; approx. 86.1 billion total brain neurons [55]
African elephant (<i>Loxodonta africana</i>)	Not conducted / not found for African elephant; Asian elephant passed in related study [56]	Not conducted / not found as formal NOR memory test [57]	Not conducted / not found for African elephant; Asian elephant tested separately [58]	Yes [59]	Very high; approx. 257 billion total brain neurons [60]
Bottlenose dolphin (<i>Tursiops truncatus</i>)	Passed, with aquatic-species caveat [61]	Not conducted / not found as formal NOR memory test [62]	Not conducted / not found [25]	Yes; sponge-tool use in bottlenose dolphins, with species-label caution [63]	Very high; inferred; direct total-brain count not found. Cortex approx. 11.7–15.2 billion neurons, and the cerebellum is estimated to contain more neurons than the human cerebellum [64, 55]
Raven (<i>Corvus corax</i>)	Not passed [65]	Not conducted / not found as formal NOR memory test [66]	Passed, mainly for better-quality food rewards [67]	Yes [68]	Middle; approx. 2.17 billion total brain neurons; approx. 1.20 billion pallial neurons [69, 44]
Parrot: macaws and African grey parrots (<i>Ara, Psittacus</i>)	<i>Psittacus</i> : not passed; <i>Ara</i> : not conducted / not found [70]	Not conducted / not found as formal NOR memory test for <i>Ara</i> or <i>Psittacus</i> [71]	Passed in macaws and African grey parrots [72]	Yes; <i>Ara</i> source available in chat, <i>Psittacus</i> noted but not separately source-cited in chat [73]	Middle; approx. 1.56 billion total brain neurons in African grey parrot and up to approx. 3.1 billion in large macaws; pallium approx. 0.85–1.92 billion neurons [69]

Notes. Neuron categories here use approximate total brain neuron counts: very low < 0.1 billion; low 0.1–1 billion; middle 1–5 billion; high 5–30 billion; very high > 30 billion. Where the original source reports “whole brain” excluding olfactory bulbs, the reported value is retained. The sheep value is an estimate, not a direct species-specific neuron count. For bottlenose dolphins, the cited paper reports cortical neuron counts and cerebellar comparisons, but not a direct total-brain neuron count. Earlier values such as 16 billion for humans, 5–6 billion for African elephants, and 1–2 billion for birds were cortical or pallial values, not total brain values.

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Scent Requires Direction: Toward an Evidence-Informed Framework for Applying Scent in Art and Cultural Heritage

Barbara Pia Jenič

University of Ljubljana, Faculty of Chemistry
and Chemical Technology
Heritage Science Laboratory
Ljubljana, Slovenia
BarbaraPia.Jenic@fkkt.uni-lj.si

Abstract

This conceptual short paper proposes an empirical research framework for the evidence-informed application of scent in museums, galleries, and cultural heritage. It argues that scent should not be treated merely as a reconstructed sample, an informational object, or ambient diffusion. Instead, research should examine how its relations to other sensory modalities are temporally, spatially, semantically, and attentively organised. Sensorial Language—a practice-derived artistic methodology developed through long-term work with multisensory compositions—provides a source of hypotheses for this proposal, rather than a ready-made museum method. Its practical observations suggest that the role of scent changes according to its relations with sound, visual access, objects, materiality, touch, narrative, and bodily movement. The paper's contribution is to translate selected principles of sensory composition from artistic practice into candidate variables for empirical investigation. It proposes that these variables be tested, refined, and developed into a context-sensitive framework for the design and evaluation of olfactory interpretation in cultural settings. The proposal is situated in relation to multisensory causal inference, crossmodal correspondences, and olfactory–visual semantic congruence.

Keywords

olfaction, perception, multisensory integration, causal inference, sensory dramaturgy, Sensorial Language, art, cultural heritage

1 From scent reconstruction to an evidence-informed framework

Olfactory heritage research has established that smells can constitute culturally meaningful heritage through their

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connections with places, objects, practices, communities, and traditions [1]. It has also developed methods for identifying, analysing, documenting, archiving, reconstructing, and presenting historic odours [2]. Museums and heritage institutions increasingly use scents as reconstructed samples, labelled olfactory objects, narrative prompts, scent stations, or ambient diffusion. These approaches may make material and intangible dimensions of the past accessible beyond images and texts alone.

Yet historical identification or chemical reconstruction does not determine how a scent will function in an exhibition or artistic situation. A historically grounded scent may remain an isolated object of identification, become a generic atmospheric addition, compete with other information, or evoke associations unrelated to an intended interpretative context. Work in olfactory museology accordingly suggests that scent depends not only on historical grounding but also on narrative framing, visitor guidance, spatial conditions, delivery methods, and the broader design of the encounter [3, 4].

This conceptual short paper proposes an empirical research framework rather than reporting a completed experiment. Its contribution is not the general claim that multisensory presentation is preferable to isolated scent presentation. Rather, it proposes a systematic translation of practice-derived principles of sensory composition into operational variables that can be isolated, compared, and empirically tested. The aim is to support the later development of an evidence-informed, context-sensitive method for olfactory interpretation in museums, galleries, and cultural heritage.

2 Sensorial Language as a source of hypotheses

Sensorial Language is a practice-derived artistic methodology developed through approximately four decades of iterative artistic work, public presentations, audience feedback, and reflective refinement of multisensory compositions [5, 6]. Its candidate variables emerged through observations of how sensory relations were composed across varied situations, including differences in spatial organisation, temporal sequencing, sensory prominence, audience movement, narrative framing, and degrees of participant engagement. It was developed for artistic practice, not as a validated method for museums or heritage institutions. Its accumulated practice-based knowledge does not constitute controlled causal evidence, nor does it prescribe a ready-made museum method.

The relevance of Sensorial Language for the present proposal lies in its practical observations about sensory composition. In this practice, scent is used in relation to sound, visual conditions, objects, materiality, touch, lighting, temperature, textual and oral narrative, spatial organisation, bodily movement, and interpersonal communication. Its

perceptual role may vary with semantic reference, intensity, duration, temporal entry, spatial source, distance from the visitor, recurrence, and place in the attentional hierarchy of a situation.

These observations provide hypotheses and candidate variables for empirical investigation. The proposal is not that museums should adopt an artistic practice unchanged. Rather, selected practical insights should be operationalised, measured, tested, refined, and translated into an evidence-informed framework appropriate to museum, gallery, and heritage conditions.

This distinction is particularly important because artistic and heritage settings may pursue different interpretative aims. In artistic practice, deliberate sensory incongruence or counterpoint may be used to create tension, ambiguity, or new associations. In heritage interpretation, by contrast, an intentional departure from semantic or historical congruence should be explicit, justified, and evaluated in relation to the interpretative aim, available evidence, and visitor understanding.

3 Candidate variables for empirical research

The proposed research framework distinguishes several possible functions of scent. Scent may be presented as information to be identified; as a material or historical trace; as an atmospheric condition; as a contextual cue attached to an object, place, or narrative; or as a modality that participates in structuring attention, sequence, and bodily engagement. These functions may overlap, but they should not be assumed to produce identical visitor responses.

The central proposition is not that scent should always be embedded in a multisensory configuration. Rather, when the interpretative aim is to support semantic understanding, narrative reconstruction, or later recall, scent is hypothesised to be more effective when it is coordinated with relevant sensory and narrative cues than when it is presented only as an isolated informational sample or artefact. This proposition is a hypothesis to be tested empirically, not a conclusion drawn from the present paper.

For empirical purposes, sensory calibration should not mean an intuitive judgement that a composition “works.” In the present proposal, it refers to specified and controllable relations among cues: for example, whether the scent and visual context are semantically congruent or incongruent; whether cues are temporally coordinated or uncoordinated; whether scent is delivered from a fixed, localised source or diffusely through a space; and whether the visitor can voluntarily engage with or avoid the scent. Calibration can therefore be described through variables rather than attributed solely to the judgement of a designer.

Candidate variables include semantic congruence; intensity and duration; temporal coordination; spatial source and

distribution; distance and visitor control; visual access; acoustic and tactile context; narrative framing; visitor movement; recurrence; and the relative prominence of competing sensory information. Such variables make it possible to move from general claims about “adding scent” toward specific, comparable configurations.

The proposed framework does not assume that one configuration is inherently superior. An isolated and labelled scent may be appropriate when identification or material documentation is the aim. Ambient diffusion may be appropriate when an environmental context is intended, provided that its intensity, circulation, accessibility, and relation to other interpretative material are carefully considered. More explicitly directed multisensory configurations may be appropriate when the aim is to structure attention, sequence perception, activate narrative relations, or produce a situated bodily encounter.

The central research question is therefore: How do temporal, spatial, semantic, and attentional relations among sensory cues influence whether scent is integrated as a contextually meaningful component of a cultural event, experienced as an isolated object, or perceived as a competing stimulus?

The proposed hypothesis is that semantic congruence and temporal coordination will each contribute to more accurate semantic interpretation and better delayed recall. The strongest outcomes are expected when scent, visual context, and narrative framing are both semantically congruent and temporally coordinated, indicating a possible interaction between these factors. When these elements are incongruent or temporally uncoordinated, semantic interpretation and delayed recall are expected to be less accurate and less consistent.

4 Measuring and developing the framework

This question intersects with cognitive science because multisensory perception is not a simple accumulation of independent sensory signals. Perceivers must infer whether signals from different modalities arise from a common cause or from separate sources [7]. The integration or segregation of sensory cues depends on inferences about their likely relation, while temporal, spatial, semantic, and attentional factors may influence this process [7, 8]. Fundamental work on multisensory integration also emphasises that the combination of sensory cues may enhance, suppress, or otherwise alter responses, depending on the conditions of integration [9]. In olfaction, semantically congruent visual context can facilitate odour perception when identification is the relevant task [10].

Future empirical research should avoid changing all candidate variables simultaneously. Instead, it could first use controlled factorial comparisons. For example, semantic congruence could be varied as congruent versus incongruent, temporal coordination as coordinated versus uncoordinated, and mode of presentation as isolated scent versus multisensory context. Such comparisons would permit researchers to

estimate the contribution of particular relations, rather than attributing any observed difference to a globally “calibrated” composition.

A first study could prioritise three primary outcomes: odour identification or response time as an indicator of perceptual attention; semantic interpretation or narrative reconstruction; and delayed recall. Perceived pleasantness, emotional valence, sensory presence, accessibility, and discomfort could be collected as secondary outcomes. This narrower design would reduce the risk of uninterpretable multiple comparisons while retaining information about affective response and visitor experience.

Future designs should also record relevant individual differences and potential confounders, including anosmia or hyposmia, prior familiarity with the scent, cultural associations, age, previous exposure, and general odour-identification ability. Such factors may influence responses independently of the sensory configuration and should therefore be considered in sampling, analysis, or both.

The proposed research framework also acknowledges that exposure to scents may be inaccessible or uncomfortable for some visitors, including people with anosmia, respiratory sensitivities, or aversions to particular scents. Clear communication and the possibility of freely choosing whether to engage with scents should therefore be incorporated into the design of the installation from the outset.

The results could then be used to evaluate and refine the candidate variables derived from practice. The intended outcome is not a universal formula for scent use. It is an evidence-informed, context-sensitive method that helps cultural institutions decide whether scent is appropriate, what role it should have, how it should be delivered, which cues should support or contrast with it, and how its effects should be assessed for particular materials, narratives, spaces, and audiences.

5 Conclusion

This paper proposes that practical observations from Sensorial Language should be treated as a source of research hypotheses rather than as a completed method for museums, galleries, and cultural heritage. Its central contribution is a research pathway: practice-derived observations can be translated into measurable variables, tested through controlled comparative studies, and developed into an evidence-informed framework for olfactory interpretation.

The question for cultural institutions is therefore not simply whether scent should be present. It is how scent should be applied, evaluated, and adjusted in relation to space, time, objects, narrative, bodily movement, visitor agency, and other sensory modalities. A method developed through this process could support more deliberate, accessible, and contextually justified uses of scent in museums, galleries, and heritage settings.

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Improving Subject-Invariant Electroencephalographic Signal Classification via Autoregressive Modeling

Sara Stalevska

University of Primorska
Faculty of Mathematics, Natural Sciences and
Information Technologies
Koper, Slovenia

Peter Rogelj

University of Primorska
Faculty of Mathematics, Natural Sciences and
Information Technologies
Koper, Slovenia

Abstract

Electroencephalography (EEG) recordings carry subject-specific information. In reality, we observe that inter-subject tasks are more challenging than intra-subject ones, as classification accuracy in this case is always lower due to subject variability. This gap in accuracy is a major challenge for developing scalable Brain-Computer Interfaces (BCIs). We investigated how autoregressive (AR) models' training data affects the performance of classification using innovative data and compared this with the classification of raw EEG signals. For the classification model, we selected EEGNet. We analyzed seven different types of data used to extract AR models. The tests were performed for three different tasks: eyes open versus eyes closed (EO/EC), resting versus movement, and left versus right hand movement. We found out that in some cases the gain of accuracy is considerable (EO/EC), while in some cases the changes are not statistically significant (movement tasks). We conclude that innovative signals may considerably improve classification if AR models are computed from the same kind of data that is later being classified.

Keywords

electroencephalography, autoregressive modelling, inter-subject classification, EEGNet, innovative signal, brain-computer interface.

1 Introduction

Electroencephalography (EEG) is a noninvasive biosignal acquisition technique widely used in neuroscience research and clinical applications to help identify neurological disorders and analyze cognitive processes [1]. While machine learning models can classify mental states and motor imagery from EEG signals [5], a core challenge in EEG classification is inter-subject variability. Brain signals vary significantly between individuals performing the same task. The reason may be in different brain functioning dependent on anatomical differences, brain connectivity patterns, and other physiological factors. As a result, inter-subject models (models trained to classify data from previously unseen subjects) generally yield considerably lower accuracy than intra-subject models (models trained and tested on data from the same individual).

This performance gap is particularly relevant in Brain-Computer Interfaces (BCIs), neuroscience research, and especially applications in medical diagnosis, where testing must often be conducted on subjects whose data cannot be collected in advance to train the

models [4]. Traditionally, researchers use concepts like domain adaptation to alleviate this problem by artificially adapting classification models to fit new individuals. We propose an alternative approach to this problem. Instead of adapting complex models to fit individuals, we aim to reduce the use of the subject-specific information that causes the problems in the first place.

We tend to decompose information obtained from brain signals into static and dynamic components. Static ones include subject specifics, intrasubject variation of neurophysiological mechanisms, and various other, often unknown factors. The dynamic ones are expected to contain all the information of current brain activity. In our approach, the static information is contained in AR models, while the dynamic one is present in the innovative signals, which are obtained as AR residual errors.

The AR model weights capture the predictable, static information (reflecting *who* the person is), while the errors carry the dynamic, task-related information (reflecting *what* they are doing). Because knowing the static parameters of the AR model allows us to completely reconstruct the raw EEG signal just from these prediction errors, it means the errors contain all required information about EEG dynamics. Consequently, they are referred to as innovative signals.

Because subject-specific information is primarily static, using these innovative signals instead of raw EEG recordings should reduce subject-specific noise and improve inter-subject classification. We have analyzed the impact of replacing raw EEG data with innovative signals on three classification tasks: eyes open and eyes closed (EO/EC, a lower difficulty problem that often serves as a sanity check for detecting methodological problems of classification algorithms), rest and movement (T0/T1-T2, distinguishing resting from active motor tasks), and left and right hand movement (T1/T2, distinguishing different motor movement tasks performed with the left or right hand).

2 Methods

2.1 Autoregressive Modeling Strategy

To extract the dynamic information from brain activity, our method relies on fitting a univariate Autoregressive (AR) model to individual EEG signals. An AR model predicts the current value of a raw EEG signal, $y(t)$, as a linear combination of its p most recent past values [2]:

$$y(t) = \sum_{i=1}^p a_i y(t-i) + e(t) \quad (1)$$

This process produces two distinct components. First, it yields a set of weights, a_i , which represent the AR model itself. These parameters define a transfer function that captures the static, stable properties of the individual's brain signal. Second, it yields a residual error, $e(t)$, representing the difference between the predicted value and the actual observed value.

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This error sequence, $e(t)$, is the innovation signal. It represents the new, unpredictable information entering the system at any given moment. Importantly, by applying the AR model weights a_i as an infinite impulse response (IIR) filter to the innovation signal $e(t)$, we can perfectly reconstruct the raw signal $y(t)$. Therefore, no dynamic task-related information is lost by transitioning from the raw signal to the innovation signal.

Conventionally, for applications like computing Granger causality, AR models are estimated from individual signal recordings or even very short window sections. In our proposed approach, we wish to obtain a static model that best describes the subject's overall signal characteristics across various states. As this part of information is expected to be static, it can be extracted from other recordings, not necessarily the analyzed signals alone. This splits the process into two steps: first, computing the AR model weights a_i from a chosen subset of training data; second, applying this fixed model as an inverse filter across the subject's remaining data to compute the isolated innovation signals $e(t)$ used for classification.

2.2 Evaluation Approach

We evaluate the improvements of the classification capabilities by comparing the classification results obtained by our proposed approach (using innovation signals) against a baseline of classification results on raw EEG data.

For classification of EEG data, we selected EEGNet [3], a widely used convolutional neural network specifically designed for EEG data. Its capabilities have been demonstrated in various EEG classification tasks, making it an ideal, reliable evaluator for our preprocessed signals. It is important that EEGNet was used with parameters proposed by its authors, not to introduce any bias by adapting to specific type of inputs.

In this phase, we used the following EEG recording types to extract the AR models:

- **Raw data:** Raw EEG signal without AR modeling.
- **Per-epoch AR:** Model fitted locally on the short epoch being classified.
- **EO model:** Model fitted on the subject's eyes-open resting data.
- **EC model:** Model fitted on the subject's eyes-closed resting data.
- **EO+EC model:** Model fitted on both resting states combined.
- **Task T1/T2:** Model fitted exclusively on active fist movement epochs.
- **Tasks and resting:** Model fitted on all task recordings (rest and movement).
- **All data:** Model fitted using all available recordings for the subject.

Finally, we apply a one-way analysis of variance (ANOVA) to the cross-validation accuracies to show whether the choice of AR training data significantly affects the classification capabilities compared to the raw baseline.

3 Results

3.1 Experimental Setup and Data

The experiments utilize the PhysioNet EEG Motor Movement/Imagery Dataset [6], containing recordings from 109 healthy subjects from 64 channels at 160 Hz. Each subject completed resting runs (EO, EC) and task runs where different sections correspond to rest

(T0), left fist movement (T1), and right fist movement (T2). Note that T0, T1, and T2 segments come from the same continuous recording session.

Preprocessing consisted of high-pass filtering at 1 Hz and ICA-based artifact removal. Afterward, 19 standard 10-20 system electrodes were retained.

For the AR modeling, we selected an order of $p = 20$, following the recommendation to use a window size of 125 ms, above the lowest recommended value of 100 ms. Signals were segmented into 4-second epochs. EEGNet was trained for 30 training epochs using the Adam optimizer with a mini-batch size of 50. Model evaluation utilized a 5-fold cross-validation, repeated 6 times to improve statistical analysis.

Table 1 summarizes the mean accuracies and standard deviations across the 30 cross-validation results (5 folds $\times$ 6 repetitions). Pairwise p -values comparing each strategy against the raw data baseline are included to denote statistical significance.

4 Discussion

The primary objective of this study was to analyze the capabilities of AR modeling for reducing the impact of subject variability on classification of EEG data. The empirical observations across all three tasks demonstrate that substituting raw EEG data with AR innovation signals can improve inter-subject classification when the discriminative information is concentrated in the dynamic component of the brain signal.

For the EO/EC task, sustained alpha oscillations are static properties of each of the two states, but when considered together, the differences between them are dynamic. By using the same model for extracting innovative signal from both, the classification results improve, if only the models are related to the analyzed brain states. Both, EO and EC models considerably improve the results, while training the models on other types of data, e.g., tasks, provides lower improvement. Interestingly, the EC model performs slightly better than the EO+EC model (86.58% vs. 86.48%); however, this marginal difference is likely noise, as there is no significant difference between them (comparing them provides a p -value of 0.835, which is greater than the 0.05 threshold), though both provide highly significant improvements over the raw baseline ($p < 0.001$). Whenever we use the same type of data for training AR models as for the classification, the results are close to the maximum. By removing the static subject traits, the classifier learned a general representation of the EO/EC distinction across subjects.

For the T0/T1-T2 classification task, we can observe higher mean accuracy when AR models are trained with task recordings (reaching 80.44% for Task T1/T2 and 80.09% for Tasks and resting). However, the statistical significance of these results is low, as p -values are much above 0.05, indicating that no significant improvement can be claimed over the raw baseline.

Conversely, for the T1/T2 task, the innovative signals do not show any decent improvement over raw signals. It is obvious that differences between left and right-hand tasks are subtle. It may be that these differences overlap with intra-subject variability, causing the subtraction of static data to be less influential. However, we can observe that using different types of data for AR extraction maintains stable performance across all models without severely degrading raw capabilities.

Furthermore, throughout all tests, the per-epoch AR strategy consistently worsened classification. When the AR model is fitted locally on a short 4-second segment, the model's transfer

Table 1: Mean classification accuracy (%), standard deviation, and pairwise p -values (vs. Raw data) across 30 cross-validation results.

Training Data Strategy	EO/EC		T0/T1-T2		T1/T2	
	Mean (Std)	p -val	Mean (Std)	p -val	Mean (Std)	p -val
Raw data	80.52 (3.28)	—	79.56 (2.70)	—	78.92 (2.01)	—
Per-epoch AR	77.51 (3.83)	0.028	75.47 (2.24)	<0.001	78.55 (1.96)	0.998
EO model	84.06 (3.91)	0.004	79.07 (2.05)	0.988	78.03 (2.46)	0.732
EC model	86.58 (2.89)	<0.001	78.31 (2.39)	0.323	78.92 (2.12)	1.000
EO+EC model	86.48 (3.17)	<0.001	79.24 (1.95)	0.999	78.41 (1.78)	0.983
Task T1/T2	82.96 (4.53)	0.148	80.44 (1.92)	0.759	78.93 (2.20)	1.000
Tasks and resting	82.82 (3.86)	0.209	80.09 (1.69)	0.980	78.93 (2.05)	1.000
All data	85.93 (3.13)	<0.001	79.98 (2.11)	0.995	78.90 (2.27)	1.000

Values in bold represent the best results for accuracy mean and std, while p -values are bold if there is a significant difference noted with respect to raw data ($p < 0.05$).

function absorbs the sustained task patterns within that specific window. Class-related brain processes dynamics is constant through the whole epoch, so all the AR model training data is as such included in the static AR model instead of left out in the dynamic component. The resulting innovation signal is left containing mostly noise. This finding heavily justifies our proposed two-step approach: AR models must be calculated from global or state-specific data arrays, not localized windows, to properly separate static traits from task dynamics.

In all three tasks, the best results are obtained when AR models are in the first step trained using the same kind of data as it is later analyzed in the second step. This confirms that the division between static properties and dynamic information is task-specific, allowing the analysis to focus on specific types of brain activity, i.e., the one with high enough variability in the AR training data. This observation sets the basis for future improvements that could better target specific activity and potentially improve classification accuracy even in more challenging tasks, such as T1/T2.

5 Conclusion

Replacing raw EEG recordings with innovation signals, obtained as residual autoregressive errors, can improve inter-subject classification accuracy. Training AR models across all target classes isolates static, subject-specific traits, allowing dynamic, class-specific information to be effectively distinguished. Consequently, compared to raw EEG data, innovative signals yield accuracy gains when target brain processes produce distinct signal changes that outweigh general variability in the subject's AR training data. This effect is most pronounced in the EO/EC task, whereas improvements in more complex tasks like T1/T2 are subtle. Nonetheless, these observations highlight how targeted AR training strategies can help reduce the challenges of inter-subject variability in EEG classification.

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Alpha/Beta - Gamma Oscillatory Dynamics as Neural Markers of Predictive Processing: Investigating feedback and feedforward processes in a social inference task

Jakob Radmilović
University of Ljubljana,
University of Vienna and Charlotte

Fresenius Privatuniversität
Kardeljeva ploščad 16,
Universitätsring 1, Seestadtstrasse
27

Ljubljana, Vienna
jr14904@student.uni-lj.si

Abstract

This work investigates whether EEG oscillations, particularly in the alpha/beta and gamma frequency bands, can be used to distinguish feedback and feedforward processes proposed by the Predictive Processing (PP) framework. More specifically, it examines whether alpha and gamma activity in posterior, particularly parieto-occipital, regions show patterns consistent with their proposed roles in feedback and feedforward signaling. Despite strong theoretical support for PP, establishing clear links between its computational principles and measurable neural dynamics remains an open challenge. Building on evidence from research on information flow within the laminar organization of the cortex, sensory neuroscience and experimental studies of predictive cognition, this paper develops a provisional theoretical synthesis of alpha/beta and gamma dynamics in predictive processing (Bastos et al., 2012). This synthesis is used to formulate a proposed model of the expected oscillatory dynamics of feedback and feedforward processing and later shows how it can be applied in a social inference task developed by Ece Kurnaz and colleagues (work in progress). This paper therefore proposes (1) a theoretically grounded model of alpha/beta and gamma dynamics, and (2) a presentation of a task for evaluating that model against collected data.

Keywords

Alpha/Beta oscillations, Gamma oscillations, Laminar studies, Neural markers, Predictive processing, Social inference

1 Introduction

Predictive processing (PP) proposes that perception and cognition depend on the continuous generation and updating of predictions about incoming sensory information (Clark, 2013; Hodson et al., 2024). These processes are commonly described within a hierarchical architecture, in which information is exchanged between cortical levels through ascending feedforward (FF) and descending feedback (FB) signaling.

Although PP has substantial theoretical influence, its proposed neurophysiological implementation remains difficult to

identify. Neural responses to expected and unexpected stimuli can be interpreted as consequences of predictive processing, but may also arise from adaptation, attention, or stimulus-driven responses (Walsh et al., 2020; Hodson et al., 2024). This problem becomes particularly relevant for EEG, which measures the aggregate activity of large neuronal populations and cannot directly isolate cortical layers or individual FF and FB pathways.

The present paper therefore examines whether alpha- and gamma-band oscillations can provide population-level markers of processes proposed by PP. Rather than assuming a direct correspondence between frequency bands and functions, we first consider the cortical organization of FF and FB signaling and its relationship to oscillatory activity, before deriving provisional predictions that can be tested using EEG.

2 Theoretical synthesis

PP describes perception as inference within a hierarchical generative model. Higher cortical levels represent increasingly abstract and temporally extended regularities, while lower levels are more closely related to the processing of incoming sensory information. Within this hierarchy, descending signals provide predictions or contextual constraints, while ascending signals transmit sensory information and mismatches that can influence the generative model which generates the predictions (Clark, 2013; Hodson et al., 2024). However, the extent to which this computational organization corresponds to a specific neural architecture remains unresolved.

The cortical laminar organization provides one possible mechanistic basis for such hierarchical communication. The mammalian neocortex contains six principal layers with characteristic patterns of connectivity. Classical anatomical descriptions associate FF projections primarily with superficial layers (L 2/3), which preferentially target middle cortical layers, particularly layer 4, whereas FB projections are more strongly associated with deep layers (L 5/6) and have broader terminations that generally avoid layer 4 (Bastos et al., 2012; Vezoli et al., 2021). Bastos et al. (2012) incorporated this organization into a proposed canonical microcircuit for predictive coding.

However, it is important to note, that FF and FB signaling cannot be reduced to one superficial FF pathway and one deep FB pathway. Vezoli et al. (2021) build on a line of work on a dual counterstream architecture containing both superficial and deep pathways, including a substantial superficial FB pathway and evidence for deep layer FF projections. Different feedback pathways also differ in their spatial range and interactions with local circuitry. Consequently, descending signaling should not

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simply be equated with the transmission of predictions; it may support several functional roles within recurrent cortical processing.

Despite the caveats, there is strong coherence in the signature oscillatory frequency with which FF and FB pathways typically operate. Bastos et al. (2012) proposed a relationship between PP circuitry and frequency-specific activity, with gamma activity preferentially associated with superficial cortical processing and alpha/beta activity with deeper cortical layers. Invasive recordings have provided evidence for this spectrolaminar organization in which gamma-band power peaks in superficial layers, particularly 2/3, whereas alpha- and beta-band power is stronger in deeper layers, particularly 5/6 (Mendoza-Halliday et al., 2024). Vezoli et al. (2021) similarly linked the anatomical organization of cortical communication to similar characteristic frequency ranges.

This anatomical and oscillatory distinction is complemented by a functional one: FF signaling is generally associated with driving excitatory inputs, whereas FB signaling is proposed to exert an overall suppressive or inhibitory influence on lower-level populations, although it can also have driving and modulatory effects depending on context (Bastos et al., 2012). Together, these anatomical, spectrolaminar and functional distinctions provide a possible chain of reasoning which can help the interpretation of hierarchical communication in population-level oscillatory activity. However, this chain does not establish that scalp-recorded gamma directly represents FF signaling or that alpha/beta directly represents FB signaling. Cortical communication is recurrent, multiple neuronal populations contribute to each oscillatory signal, and the same frequencies can be modulated by attention, sensory processing, and other cognitive processes. Indeed, recent work has explicitly challenged a simple oscillatory division in which alpha/beta represents predictions and gamma represents prediction errors, emphasizing the importance of transient and context-dependent dynamics (Vinck et al., 2025).

Alpha and gamma nevertheless provide useful candidate signals at the population level. Alpha activity has been associated with functional inhibition and gating, with increased alpha power often accompanying reduced processing of task-irrelevant information and alpha suppression accompanying engagement of task-relevant sensory regions (Jensen & Mazaheri, 2010). Gamma synchronization, in contrast, is frequently associated with localized sensory processing and neuronal communication (Fries, 2015). Their complementary functional properties, together with their proposed laminar organization, provide a basis for investigating different stages of hierarchical processing without assuming that either frequency is computationally specific.

3 Predicted dynamics / hypotheses

The literature on predictive-processing tasks provides several provisional predictions primarily concerning oscillatory dynamics in posterior sensory regions. First, expectation formation and maintenance should be accompanied by modulation of pre-stimulus alpha/beta activity in posterior regions. Increased alpha/beta power has been reported before expected sensory events, including implicitly learned face

sequences and probabilistic attentional cues (Roche et al., 2021; Li et al., 2023).

Second, unexpected stimuli may produce greater post-stimulus alpha event-related desynchronization (ERD) in posterior regions than expected stimuli, following from the functional-gating interpretation of alpha, in which reduced alpha activity is associated with increased engagement of sensory processing (Jensen & Mazaheri, 2010).

Third, greater mismatch between expected and observed information may be accompanied by increased post-stimulus gamma activity in posterior regions. This follows from predictive-coding accounts linking higher-frequency activity to ascending sensory processing and from empirical studies reporting stronger gamma responses to unexpected or mismatching stimuli (Bastos et al., 2012; Strube et al., 2021; Roche et al., 2021).

Taken together, these predictions suggest a temporal sequence within posterior sensory regions: low-frequency activity may be particularly informative during the formation and maintenance of expectations, while post-stimulus alpha and gamma dynamics may reflect subsequent processing and updating.

These hypotheses remain provisional and are intended to provide falsifiable predictions for the empirical analysis. Frontal regions may serve as potential sources of top-down modulation of these posterior dynamics, but the primary predictions concern posterior activity.

4 Empirical approach

In a social inference task developed by Ece Kurnaz and colleagues (personal communication, 2026), each trial begins with a probability cue indicating the likelihood that a target object is present in a subsequently revealed scene; participants judge object presence as the target region gradually unblurs. The cue is predictive of the correct answer on 70% of trials, yielding prior-congruent and prior-incongruent trials, alongside a neutral condition in which the cue carries no informative bias. The social inference task follows an analogous structure: a prior characterizing the relationship between two depicted individuals (e.g., friends, a positive-valence prior) precedes a binary judgment (e.g., whether they will help each other) made as the scene gradually unblurs; as in the visual task, the prior is predictive of the outcome on 70% of trials, with an analogous neutral condition. This parallel structure allows the visual task to serve as a lower-level perceptual control, isolating effects of social content from the probabilistic-cueing and gradual-evidence-accumulation structure shared by both tasks.

5 Discussion / Outlook

The framework that is being developed here provides a possible route from predictive processing to measurable EEG dynamics. PP proposes hierarchical exchange between ascending and descending information streams; cortical anatomy provides partially distinct laminar pathways through which these signals interact; and invasive recordings indicate that these compartments exhibit characteristic oscillatory dynamics. Alpha and gamma can therefore be treated as candidate population-

level markers through which aspects of hierarchical processing may become observable.

This chain should not, however, be interpreted as a direct mapping between computational function, cortical pathway and frequency band. The multiplicity of FF and FB pathways, recurrent cortical dynamics, and the sensitivity of alpha and gamma to attention and sensory processing all constrain such an interpretation. The recent emphasis on transient and context-dependent dynamics further suggests that oscillatory activity alone may not provide a complete account of predictive processing (Vinck et al., 2025).

The value of the proposed framework therefore lies in constraining interpretation rather than providing a direct anatomical readout. By linking PP to cortical architecture and spectrolaminar dynamics, it becomes possible to formulate more specific predictions about population-level EEG activity than would be possible from changes in alpha/beta or gamma power alone. Subsequent work should test whether these predicted dynamics are observable during social predictive processing and, in doing so, assess how far EEG oscillations can usefully inform the proposed neurophysiological mechanisms of PP.

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Where Do People Get Mental Health Information? A Latent Class Analysis of Information-Seeking Profiles and Their Sociodemographic Predictors

Adela Černigoj[†]

Sociomedical Institute
Research Centre of the Slovenian
Academy of Sciences and Arts
Ljubljana, Slovenia
adela.cernigoj@gmail.com

Lilijana Šprah

Sociomedical Institute
Research Centre of the Slovenian
Academy of Sciences and Arts
Ljubljana, Slovenia
lilijana.sprah@zrc-sazu.si

Abstract

Background: Access to reliable mental-health information can shape awareness, help-seeking, and engagement with available support. However, people differ in the sources they use, and these patterns may vary across sociodemographic groups. Understanding patterns of information seeking may help inform more targeted mental-health communication and outreach strategies.

Aims: We therefore aimed to identify distinct profiles based on the sources people use to obtain mental-health information and to examine which sociodemographic characteristics predict membership in different information-seeking profiles.

Methods: A cross-sectional quantitative study was conducted between July 2025 and July 2026, involving 793 participants ($M_{\text{age}} = 42.3$ years, $SD = 16.4$; 39.6 % men). Data were collected both online and using paper-and-pencil questionnaires. The survey included sociodemographic questions and a multiple-response question asking participants where they most often obtained information about mental health. Six information sources were listed: 1) family and friends, 2) health professionals (e.g. doctors, psychologists, therapists), 3) books, brochures, manuals, 4) television, radio, 5) the internet, social media, and 6) public awareness programmes (e.g., national campaigns, workshops). Participants could also indicate that they did not seek mental-health information. Latent class analysis was performed to identify distinct patterns of mental-health information seeking based on participants' use of the six information sources. Multinomial logistic regression was used to examine sociodemographic predictors of profile membership among 766 participants with complete covariate data, controlling for mode of participation.

Results: Descriptive results revealed that more than one-third of participants selected only one of the six listed sources (35.8%), while 6.4% indicated that they did not seek mental-health

information. The most commonly used source was the internet or social media (selected by 56.2% of participants), followed by books or manuals (46.8%) and health professionals (37.5%). A three-class solution was retained. Class 1 comprised limited, predominantly online seekers (56.8%), Class 2 comprised broad, multi-source seekers (26.0%), and Class 3 comprised health-professional-oriented seekers (17.2%). Multinomial logistic regression revealed that gender, farming status, and mode of participation were associated with membership in the mental-health information-seeking profiles, whereas age, education, and socioeconomic status were not. Women were more likely than men to belong to both the broad multi-source and health-professional-oriented profiles rather than the limited, predominantly online profile. Moreover, women were more likely to belong to the broad multi-source profile than to the health-professional-oriented profile. Farmers, in contrast, were less likely than non-farmers to belong to either of the two more active profiles and were therefore relatively more likely to belong to the limited profile. Online participants were also more likely than paper-and-pencil participants to belong to the two more active profiles.

Conclusion: Overall, the findings suggest that gender primarily distinguished broad from more selective information seeking, whereas farming status distinguished limited from more active information seeking. The results highlight groups that may be less likely to engage with a broad range of mental-health information sources and may therefore be better reached through tailored information strategies.

Keywords

mental health information, mental health literacy, information-seeking, latent class analysis, gender, farmers

[†]Corresponding author

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Dual-task effects on gait adaptability and cognitive performance in healthy adults

Metka Močilar
University rehabilitation institute Soča
Ljubljana, Slovenia
metka.mocilar@ir-rs.si

assoc. prof. Urška Puh, PhD
University rehabilitation institute Soča
Ljubljana, Slovenia
urska.puh@ir-rs.si

Abstract

Introduction: Activities of daily living frequently require simultaneous performance of multiple tasks, demanding divided attention and resulting in cognitive-motor interference [1]. Falls are often caused by a combination of external and internal factors, as well as reduced attention during walking, particularly when tasks are performed concurrently [2]. Limited gait adaptability, defined as the ability to modify the walking pattern in response to environmental and task demands, represents an important risk factor for falls. Most previous studies have focused on straight-line walking at a constant speed [3], which does not adequately reflect the complexity of gait in everyday life. The aim of this study was to investigate dual-task effects on gait adaptability and cognitive performance in healthy adults.

Methods: This cross-sectional study was conducted in two separate phases using convenience sampling. Thirty participants were included in the first phase and 31 in the second, with 17 individuals participating in both phases. Participants were 30-61 years old. Gait analysis at preferred walking speed was performed using instrumented treadmill C-Mill. Participants completed three primary walking conditions: straight-line walking, obstacle crossing, and walking with unpredictable accelerations and decelerations. These conditions were performed without and with five added tasks: a verbal fluency task, serial subtraction by threes, using a walking cane, carrying a full glass of water and using a rollator walker. Spatiotemporal gait parameters, performance outcomes (obstacle crossing success and performance during accelerated/decelerated walking) and dual task costs were analyzed in two sets of comparisons: (1) each dual-task versus the corresponding single-task walking condition, (2) the effects of dual-task conditions across different walking tasks. In addition, cognitive task performance was analyzed and compared during walking versus seating. The study was approved by the institutional ethics committee (No. 035-1/2021-32/4.3).

Results: During straight-line walking, all added tasks affected spatiotemporal gait parameters, with the greatest impact observed when walking with a cane. During obstacle crossing,

cane use significantly reduced cadence, whereas none of the added tasks affected obstacle-crossing success. While walking with accelerations and decelerations, added tasks did not influence cadence, however, they significantly reduced performance success compared to walking without an added task. Analysis of participants who took part in both study phases ($n = 17$) showed that obstacle crossing without an added task, with verbal fluency, or with a cane use resulted in the lowest cadence compared with straight-line walking and walking with accelerations/decelerations under the same experimental conditions. Performance of the verbal fluency task did not differ between conditions, whereas performance of the serial subtraction was significantly worse during walking compared to seating, indicating the presence of cognitive-motor interference in walking. All reported differences were statistically significant ($p < 0.05$).

Conclusions: All added tasks altered spatiotemporal gait parameters during straight-line walking, while a cane use specifically reduced cadence during obstacle crossing. While walking with accelerations and decelerations, added tasks impaired performance success without affecting cadence. Serial subtraction performance demonstrating cognitive-motor interference in walking compared to seating position. The impact of added tasks depends on type of walking task and the nature of the secondary task, providing a basis for future studies and for the clinical assessment of gait stability in populations at increased risk of falls.

Keywords

dual task, gait adaptability, healthy adults

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Working Memory Strategies Meet Task Interference

Benjamin Bušelič

Department of Psychology
Faculty of Arts, University of
Ljubljana
Ljubljana, Slovenia
benjamin.buselic@ff.uni-lj.si

Grega Repovš

Department of Psychology
Faculty of Arts, University of
Ljubljana
Ljubljana, Slovenia
grega.repovs@ff.uni-lj.si

Anka Slana Ozimič

Department of Psychology
Faculty of Arts, University of
Ljubljana
Ljubljana, Slovenia
anka.slanaozimic@ff.uni-lj.si

Abstract

Working memory (WM), as defined by Baddeley and Hitch [1], is the cognitive ability to temporarily maintain and manipulate information needed for cognitive tasks. Baddeley and Hitch [1] proposed a multicomponent model of WM, which introduces modality-specific components (e.g., the visuospatial sketchpad for visual and the phonological loop for verbal information) [1]. This notion of separate storage has been examined using the dual-task paradigm, in which participants perform a secondary task during the WM task. Prior work has shown that a dual task in the same modality as the WM task can impair WM performance [2]. For example, performing a secondary verbal task during a verbal WM task impairs performance on the WM task. Relatedly, recent work [3] also describes WM strategies, different ways of performing a WM task that can rely on different representational formats (e.g., verbal, visual, spatial), consistent with the modality-specific components of the multicomponent model of WM. The present study brings these strands together, examining whether different strategic representational formats do indeed recruit different WM components, using a dual-task approach.

To address this question, we recruited 63 psychology students (54 female, 8 male, 1 other; $M_{\text{age}} = 19.2$ years, $SD_{\text{age}} = 0.6$ years), designed a computerized visual change-detection task, and developed accompanying strategic approaches to it. The task required participants to encode four visual stimuli (“keys”) in a whole-display change-detection task. After a brief delay, they had to report whether any of the stimuli had changed orientation. To introduce them to the task, participants first completed the task without strategic instructions (*spontaneous baseline condition*). Results from the spontaneous baseline condition were not included in the analysis. We then introduced participants to a visual and a verbal strategy, intended to engage visuospatial sketchpad and phonological loop, respectively, and trained them in their use. Using each trained strategy, participants performed the WM task both without a secondary task (*no interference conditions*) and with a verbal or visual secondary task during maintenance (*interference conditions*). This yielded six conditions, with each strategy (verbal and visual) combined with three interference conditions: no interference, verbal interference, and visual interference. We estimated WM capacity with *Pashler's K* [4] and compared capacity under different conditions using two repeated-measures ANOVAs.

A strategy type (verbal, visual) $\times$ interference presence (present, absent) ANOVA showed that capacity was significantly lower

when a secondary task was present than absent, $F(1, 58) = 25.33$, $p < .001$, $\eta^2p = .30$; the interaction between strategy types and interference presence was not statistically significant ($F(1, 58) = 1.25$, $p = .27$, $\eta^2p = .02$). Further, a strategy type (visual, verbal) $\times$ interference modality (verbal interference, visual interference) ANOVA revealed no main effect of interference modality, $F(1, 58) = 4.60$, $p = 0.07$, $\eta^2p = 0.07$, nor interaction between the strategy type and interference modality, $F(1, 58) = 0.03$, $p = .87$, $\eta^2p < .001$, indicating that the interference cost did not depend on the match between strategy and interference modality.

These results are consistent with an effect of interference on WM performance, but they provide no evidence that different strategic representational formats recruit different WM components, as the interaction between strategy type and interference modality was not significant.

The study had several limitations. Most importantly, the strategy training was short and not personalized, so we cannot confirm that the strategies were successfully employed and engaged the intended WM components (e.g., phonological loop). Moreover, it is possible that our interference tasks did not interfere with the intended processes (i.e., verbal or visual). As we were unable to determine whether the intended WM components were successfully engaged or whether the interference tasks selectively disrupted the targeted processes, we propose that future research should examine the neural correlates of strategy use to verify both successful strategy deployment and the effectiveness of the interference manipulation.

Keywords

Working memory, strategies, dual-task, interference, modality

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Enacting Colour: The Observer Between Biology and Culture

Meekshuma Nayeck
Academy of Fine Arts and Design (ALUO)
University of Ljubljana
Ljubljana, Slovenia
meekshumanet@gmail.com

Abstract

Colour is not a fixed property transmitted to a passive receiver but is enacted, brought forth at the meeting of a living body and a structured environment (Maturana and Varela, 1987; Uexküll, 1934). This paper's contribution is a four-level model of colour perception that integrates enactive cognition with cultural and period-specific perceptual formation. On this model, colour is co-constituted across four interacting levels at once: the biological (visual physiology), the phenomenological (lived seeing, following Merleau-Ponty's account of vision as a "second bringing-forth," 1964), the atmospheric (Trstenjak's *barvna klima*, or colour climate, 1978), and the social-institutional (Baxandall's period eye, 1972). Colour is therefore neither purely retinal nor purely cultural, but the ongoing product of an observer situated at every level.

The model is developed through comparative visual analysis, grounded in enactive and phenomenological theory, of Jean-Léon Gérôme's *The Snake Charmer* (c. 1879). Worked through all four levels, and attending to specific pigments, tiles, and textiles, the analysis shows how culturally situated knowledge shapes what is seen, not merely how it is interpreted. Treating perception as situated and produced rather than passively received (Berlot Pompe, 2016, 42), the paper locates cultural and institutional formation as a constituent of the perceptual act rather than a later interpretation of it, thereby engaging the debate over the cognitive penetrability of perception (Pylyshyn, 1999; Firestone and Scholl, 2016). Osman Hamdi Bey's *The Tortoise Trainer* (1906), painted by an Ottoman artist trained in the same Parisian academic milieu as Gérôme and working both within and against orientalist convention, serves as a contrasting enactment: the same chromatic repertoire brought forth by a differently situated observer.

The paper offers cognitive science a concrete articulation of enactive and Umwelt-based approaches to perception, extended from organism-environment coupling to the cultural shaping of the perceiving observer.

Keywords

colour perception, enactive cognition, Umwelt, period eye, situated perception.

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Cortical Control of Cognitive–Motor Interaction During Balancing and Walking in Early Parkinson’s Disease*

Manca Peskar†

Science and Research Centre
Koper, Slovenia;
Technical University Berlin,
Germany;
University of Ljubljana, Slovenia;
manca.peskar@zrs-kp.si

Nina Omejc

Jožef Stefan Institute, Slovenia;
Jožef Stefan Postgraduate School,
Slovenia;
nina.omejc@ijs.si

Aleksandar Miladinovic

Institute for Maternal and Child
Health IRCCS "Burlo Garofolo",
Trieste, Italy;
aleksandar.miladinovic@burlo.trieste.it

Paolo Manganotti

Cattinara University Hospital,
University of Trieste, Italy;
paolo.manganotti@unitn.it

Klaus Gramann

Technical University Berlin,
Germany;
klaus.gramann@tu-berlin.de

Uros Marusic

Science and Research Centre
Koper, Slovenia;
Alma Mater Europaea University,
Maribor, Slovenia;
uros.marusic@zrs-kp.si

Abstract

INTRODUCTION: People with Parkinson’s disease (PD) often rely on increased conscious control to compensate for impaired motor regulation. As cognitive resources decline, this compensation may become insufficient, affecting both postural stability and gait. This study aimed to identify behavioural and neurophysiological signatures of cognitive–motor interaction during whole-body tasks in early PD, which remain incompletely characterized to this day.

METHODS: Eighteen individuals with PD (mean age: 62.9 ± 6.6 years) and 18 age- and sex-matched healthy controls (HC; mean age: 62.9 ± 6.4 years) completed a balance task comprising semi-tandem stance, Stroop-based cognitive, and combined dual-task conditions. A subsample (11 PD, 13 HC) also completed an overground walking task under single- and dual-task conditions. Mobile electroencephalography (EEG) was recorded throughout to assess event-related potentials, spectral power, and gait-phase-related spectral modulation. Behavioral outcomes included postural sway and gait performance.

RESULTS: Balance: PD participants demonstrated smaller ($p = .009$) and slower ($p = .008$) sway compared to HC, while dual-tasking reduced sway across groups ($p < .001$). EEG revealed increased delta/theta power with cognitive demand ($p < .012$; Fz, Cz, Pz, Oz), stronger beta desynchronization during motor engagement ($p < .050$; Cz, Pz), greater alpha desynchronization

during dual-tasking ($p = .025$; Pz), and elevated P300 latencies in PD ($p = .034$; 600-700 ms). Walking: PD participants walked slower and spent longer in double support than HC ($p < .05$). Dual-task walking reduced speed and increased stride time, double-support time, and swing-phase variability across groups (all $p < .05$). Gait-related EEG modulation showed typical synchronization during double support and desynchronization during swing, but these patterns were attenuated in PD, with significant frontocentral group differences across the gait cycle.

DISCUSSION: Reduced sway in PD may reflect rigidity, while dual-task-related sway reductions suggest greater reliance on automatic postural control under divided attention. Attenuated gait-phase-related spectral modulation indicates impaired sensorimotor integration. Although standing EEG patterns were largely preserved, prolonged P300 responses and reduced gait-phase related oscillatory dynamics point to early deficits in cognitive-motor integration.

CONCLUSION: Early-stage PD shows subtle disruptions in cognitive-motor integration during balance and walking. Event-related potentials and gait-related cortical oscillations may serve as sensitive neural markers for mobility assessment and fall-prevention interventions.

Keywords

Parkinson's Disease (PD), Electroencephalography (EEG), Mobile Brain/Body Imaging (MoBI), Dual-Tasking, Embodied cognition

*Contribution Title

†Corresponding and Presenting Author

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