





Evidence Synthesis & DEST

Creative Research Methodologies in ODDE EDEN NAP Webinar 20 December 2023









≜UCL

Current positions

- Research Fellow, EPPI Centre (UCL, UK)
- Adjunct Associate Professor (University of Stavanger, Norway)
- Research Fellow (National Institute of Teaching, UK)













Evidence synthesis

"Rather than looking at any study in isolation, we need to look at the body of evidence" 1







What are SRs and why are they important?

- "a review of research literature using systematic and explicit, accountable methods"
 - > Transparent and explicit
 - Replicable and updatable
 - Identify gaps, contradictions or (in)consistencies
 - > Can help inform policy and practice



1. Gough et al. (2012, p. 2)







Review Family

Traditional review family

- Critical review
- Integrative review
- Narrative review
- Narrative summary
- State of the art review

Systematic review family

- Metaanalysis
- Systematic review

Review of review family

- Review of reviews
- Umbrella review

Rapid review family

- Rapid reviews
- Rapid evidence assessment
- Rapid realist synthesis

Qualitative review family

- Qualitative evidence synthesis
- Qualitative metasynthesis
- Meta-Ethnography

Mixed methods review family

- Mixed methods synthesis
- Narrative synthesis

Purpose specific review family

- Content analysis
- Scoping review
- Mapping review

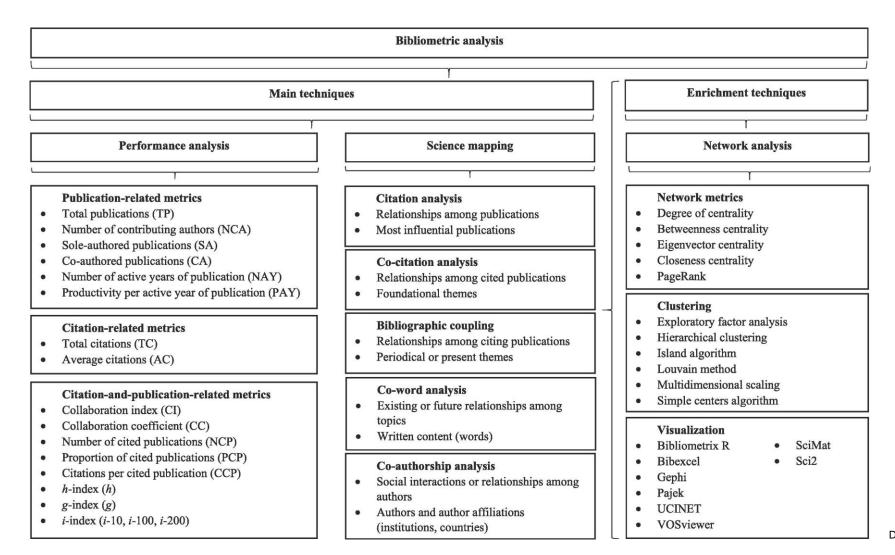
Bibliometric reviews?







Bibliometric analysis



Donthu et al. (2021, p. 288)







Evidence syntheses undertaken

Mapping reviews

- Student engagement and educational technology in higher education
- Use of digital evidence synthesis tools in educational technology – mapping review
- COVID-19 studies on teaching and learning in higher education
- Language bias & methodological approaches to evidence synthesis – meta review
- Use of DEST in climate & health
- Pre-service teachers and lesson observations

Systematic reviews

- Student engagement and the flipped learning approach (K-12)
- Artificial Intelligence in Higher Education
- Teaching and learning in secondary schools during COVID-19
- Artificial intelligence in education meta review
- Mothers undertaking doctoral studies systematic review

Rapid reviews

 COVID-19 studies on teaching and learning in K-12 (rapid review)

Scoping reviews

- Learning analytics and student engagement in K-12
- Experiences of disabled pre-service teachers scoping review
- Programming and computational thinking in K-12 meta review

Bibliometric analyses

- BJET 50 years content & authorship analysis
- AJET evaluation & content analysis
- AJET content & authorship analysis 2013-2017
- BERJ 1995-2004 content & authorship analysis
- *IJETHE* content & authorship analysis







BJET Authorship & Content Analysis

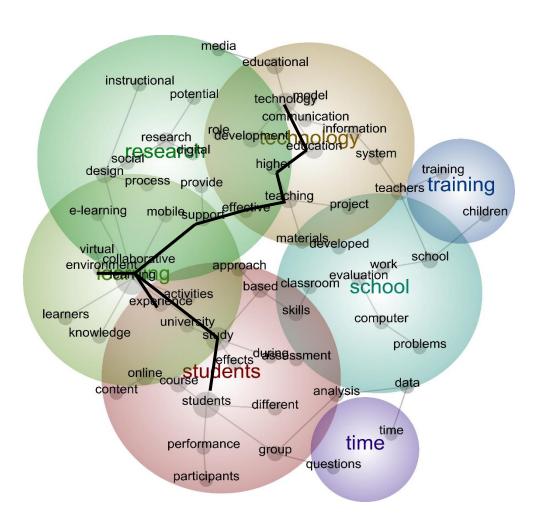
- 1. What research trends and issues were published in BJET from 1970 to 2018 and how have these evolved?
- 2. How has BJET contributed to furthering scholarship in the field of educational technology?
- 3. To what extent has BJET reflected a focus on British scholarship from 1970 to 2018?
- 4. How have authorship/co-authorship patterns in BJET changed over time?

Table 8: Evaluation of BJET Quality

Rigour	Influence	Prestige
 12% acceptance rate Two-stage review process Single blind peer-reviewed Reviewers must be research active and have peer review experience 2 weeks for initial screening of submissions Acceptance time better than average 	 Published 6 times per year Supports Gold Open Access and publishing of pre-print versions online Ranked in the top four educational technology journals 23/235 in Education & Educational Research 	 Journal of BERA, globally recognised professional association Considered a very influential journal internationally, in both prestige and visibility Highly respected editors and editorial board, including an International Advisory Board

Bond et al. (2019)

Trends in educational technology across 50 years



- Learning and students as the key concern
 - Learning-support-effective-teaching-highereducation-technology

- Student engagement
 - Students-study-learning-environment
 - Students-study-learning-experience
 - Students-study-learning-support-effectiveteaching

International trends in educational technology 2010s

Media integration	 MOOCs Mobile learning Social media Web 2.0 & collaborative learning tools
Distance education	 Online & blended learning Online assessment & feedback Online community development (constructivist approaches) Open Educational Resources (OER)
Instructional design	 Learning analytics Big data Assessment Ethics & privacy Online collaborative environments Threshold concepts More student-centred & activity based Development of instructional models, informed by theory

1970s	1980s	1990s	2000s	2010s
Inappropriate equipment	-			Device compatibility
In-service teachers lack professional dev. (PD)				+
Teachers lack time to upskill	-			-
Teacher unwillingness to attend PD				+
Lack of pre-service PD				
No differentiation or pedagogical adjustment		-		
Ongoing suspicion & caution about ed tech				
	Lack of money to fix equipment	Insufficient time to implement new tech	Schools restricting access School policies	
	Lack of programming knowledge	Teachers lack confidence		-
	Management of resources	Student technical skills not advanced		-
			Lack of IT support	
			Internet access / Digital divide (parents)	

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Teachers lack time to upskill				+
Teacher unwillingness to attend PD				-
Lack of pre-service PD				
Ongoing suspicion & caution about ed tech				-
			Schools restricting access School policies	
		Teachers lack confidence		
		Student technical skills not advanced		-
			Lack of IT support	-
			Internet access / Digital divide (parents)	





Systematic Mapping Review



Methodological approaches to evidence synthesis in educational technology: A tertiary systematic mapping review

- Katja Buntins
- Svenja Bedenlier
- Victoria Marín
- Marion Händel
- Melissa Bond

- 1. How transparent and comprehensible is the presentation of evidence synthesis methods in reviews in the field of educational technology?
- 2. How many studies are fully replicable?
- 3. Are there differences depending on the type of review/evidence synthesis?

Artificial Intelligence in Higher Education: A Meta Review

- Melissa Bond
- Phuong Pham
- Maarten de Laat
- Hassan Khosravi
- George Siemens

- Nina Bergdahl
- Violeta Negrea
- Sin Wang Chong
- Emily Oxley

- 1. What is the nature and scope of AIEd secondary research?
 - Review and publication types
 - Authorship and geographical distribution
 - Research collaboration
 - Technology used
 - Research quality, general findings & research gaps

Buntins et al. (2023)

Bond et al. (2023)





Systematic Mapping Review



EdTech tertiary mapping review¹

 Web of Science, Scopus, ERIC, Google Scholar, FIS, Dialnet, OpenAlex & snowballing.

Inclusion	Exclusion
Secondary research	Primary research
Focus on EdTech	No focus on EdTech
Education related	No connection to education
Articles, chapters, reports, papers	Papers, posters, editorials
Has a method section	No method section
English, German or Spanish	Other languages



AIHEd meta review¹

 Web of Science, Scopus, ERIC, EBSCOHost, Google Scholar, IEEE Xplore, Science Direct, ACM Library, OpenAlex & snowballing.

Inclusion	Exclusion
Jan 2018 – July 2023	Published before 2018
Applications of AI in education	Not about AI
Formal teaching & learning	Informal learning
Journal article or conference paper	Chapters, editorials, theses
Secondary research	Primary research
English language	No method section







Most used DEST



EdTech tertiary mapping review

n = 295

3.7% used evidence synthesis software

Most used tools			
Spreadsheet (e.g. Excel)	13.9%		
CMA	9.5%		
Reference management software	8.1%		
R	5.8%		
SR software (any)	3.7%		
NVivo	2.7%		
VOSViewer	2.7%		
Atlas.ti	2.4%		
RevMan	2.4%		
Word / MAXQDA	2.0%		
SPSS / Stata	2.0%		

AIHEd meta review

n = 297

5.1% used evidence synthesis software

Most used tools	
Spreadsheet (Excel)	13.8%
Reference management software	12.1%
VOSViewer	6.7%
R	6.4%
SR Software (any)	5.1%
Python	3.0%
CiteSpace	2.7%
Rayyan	2.0%
CMA	2.0%
Stata	1.7%
Word	1.7%





Most used tool by review type



EdTech tertiary mapping review $n = 295$		AIHEd meta review $n = 297$	
Systematic review	Spreadsheet	Systematic review	Spreadsheet
Bibliometric review	VOSViewer	Bibliometric review	VOSViewer
Meta-analysis	CMA	Meta-analysis	CMA
Scoping review	Spreadsheet	Literature review	RMS, Word
Critical review	RMS	Mapping review	Spreadsheet
Integrative review	Word	Scoping review	SR software, RMS









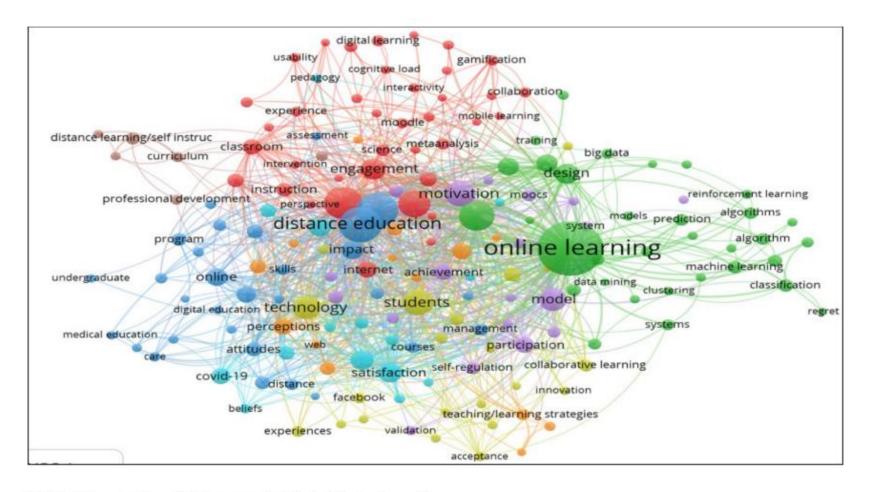


Fig. 4 Keywords with the greatest *total link strength*

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https://citespace.podia.com/

CiteSpace, v. 6.1, R4 (64-bit) Basic December 2, 2022 at 4:33:55 PM CST WOS: D·!! 爱鉴包icitespace/data_ethic/data Timespan: 2018-2023 (Slice Length+1) Selection Criteria: g-index (k=25), RFP=3.0, L/N=10, LBY=5, e=1.0 Network: N=210, E=900 (Density=0.041) Largest CC: 194 (92%) Nodes Labeled: 1.0% Pruning: None Modularity q=0.4369

Weighted Mean Silhouette \$=0.7465 Harmonic Mean(Q, S)=0.5512

CiteSpace



#6 artificial intelligence literacy
#5 big data
#3 artificial intelligence
#3 artificial intelligence

#1 data science #0 learning analytics

#2 systematic review

#4 information



Fig. 3 Co-occurrence network of keywords. From 2018 to 2023 (top 10 clusters).

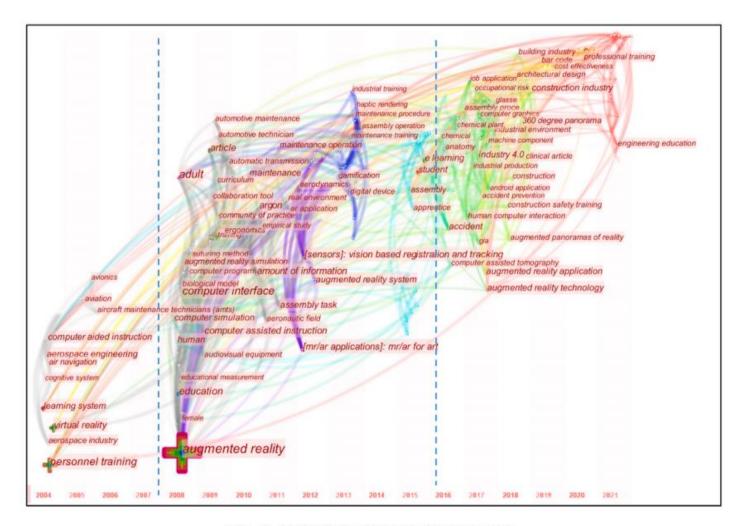


Fig. 5. Keyword co-occurrence time zone map.

Guan et al. (2023)

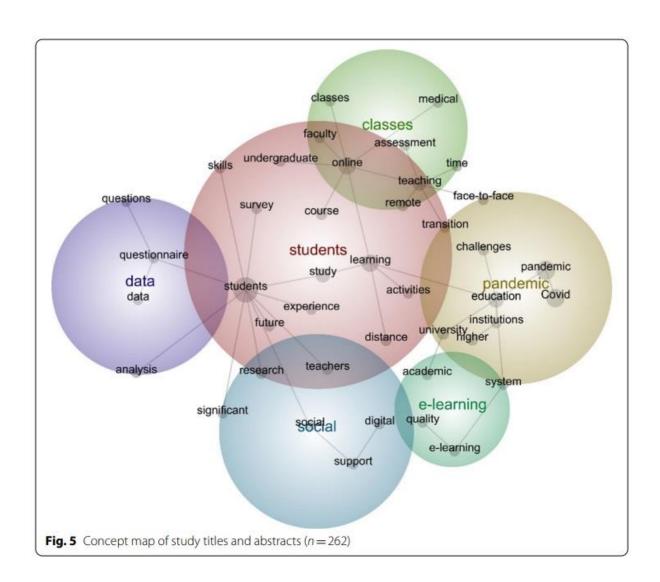




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Leximancer

- Content analysis/text mining
- Semantic relations
- Concept mapping
- Online portal
- Not free
- Free webinars
- Visit: https://www.leximancer.com/



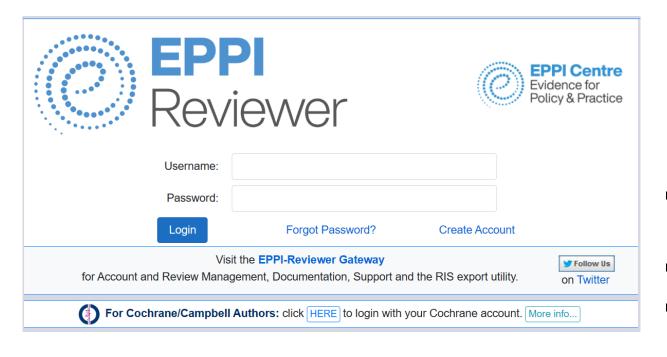


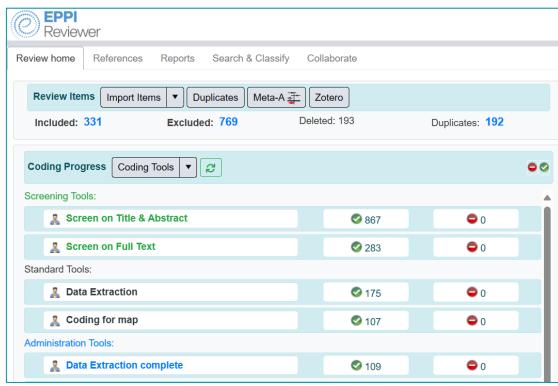
EPPI-Reviewer



https://eppi.ioe.ac.uk/eppireviewer-web

- Works with modern browsers (Firefox, Safari, Chrome).
- Works on web-enabled devices, e.g. smartphones and tablets.
- Uses the same data as EPPI-Reviewer 4.





- Based on same tech as Google Docs and Gmail.
- PubMed and OpenAlex integrated.
- Machine learning incl. priority screening



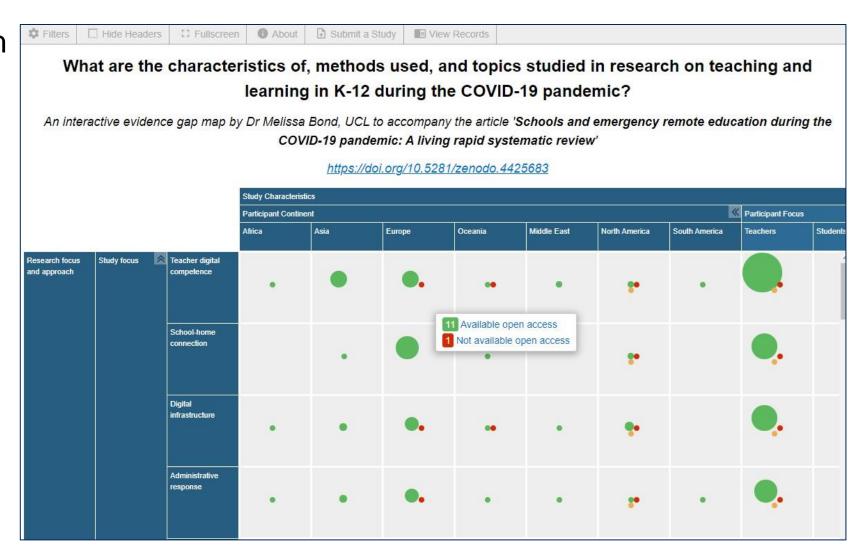


Interactive evidence and gap maps



- Created for each research question
- Freely available open access
- Filterable, searchable
- Can download references
- Direct links to studies
- Can assist synthesis

https://eppi.ioe.ac.uk/cms/Default.aspx?tabid=3794



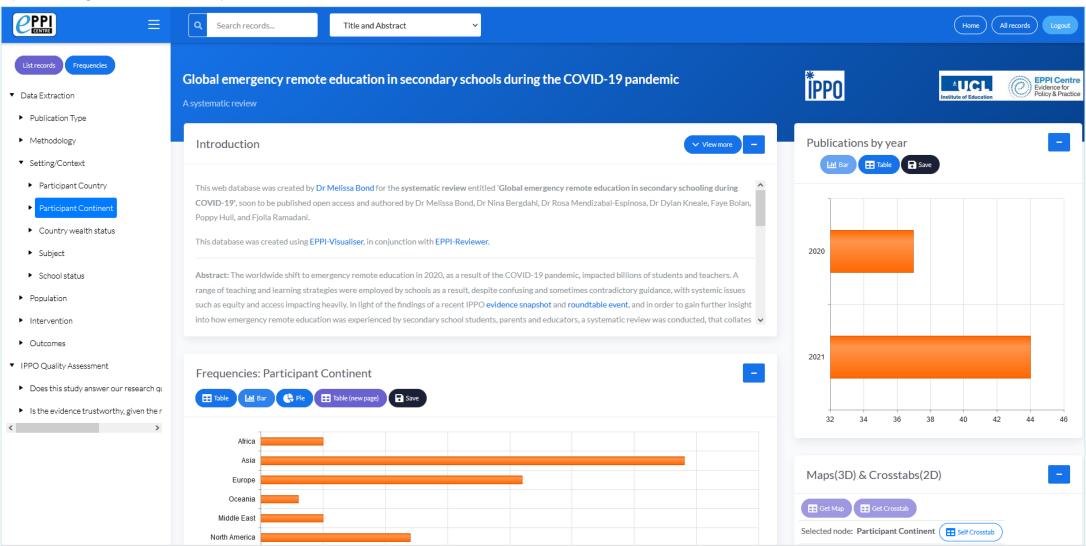


EPPI-Visualiser



EPPI-Visualiser is a new web database tool, displaying the studies and coding conducted in your review.

> Any changes made in your review are updated live in the database.









DEST

Planning Work network PredicTER TaskExchange Identify the issue and determine the question Parsifal SLR-Tool Whole process Deduplication CADIMA ReLiS SRDB.PRO PICO Portal SRA Synthesisr JBI-SUMARI SASR StArt Open-meta.app
 SESRA Thoth Write a protocol Screening EPPI-Reviewer Screen-IT Abstrackr Inciteful.xyz · Publish or Metagear SRA Search ArticleNet Papers-review Subscreen 2DSearch Jane Perish ASReview PICO Portal SWIFT-Active JSTOR Text A2A PubReMiner BioReader PubVenn RAx Screener Ananse anlyser Search for studies Colandr SWIFT-Review APSE LDS Shiny Rayyan RAx BADERI Covidence Revtools SyRF Leaf RCT tagger DistillerSR BEST RobotAnalyst Sysrev Lingo3G Researchr DoCTER RobotSearch Bioreader Litmaps RobotAnalyst Carrot2 Litsearch Sci2 Tool Sift and select studies Citationchaser Mapping Searchrefiner Data extraction EvidenceSET RAx CitNetExplorer MEDLINE · SensPrecOpti- CERC ExaCT Refchaser CloudSERA Medline mizer Cochrane · Graph2Data Scholarcy Colandr (Pubmed) SLRqub Import.io SvRF scraper Coremine trend SRA Colandr MetaDigitise Sysrev Extract data from studies Medical Medline Textpresso ContentMine Metagear Table Builder Trialstreamer • CTD Transpose Topictagger Covidence Numbat DistillerSR MeSHSIM VOSViewer PICOtron WebPlotDigi- DAA DOC Search NAILS Vovant Tools Distiller SR PlotDigitizer tizer Wordstat 9.0 Findpapers OmixLitMiner Assess the quality of the EPPI-Reviewer • PubMed2XL Wordstat 9.0 GScraper Paperscraper Yale MeSH studies Import.io PDQ-Evidence Analyser Pex EPPI-Reviewer Critical apprisal Robvis AMSTAR GRADEpro Sysrev Checklist ORBIT Matrix Systematic Reference EndNote Qiqqa Combine the data Refbase JabRef Covidence Generator Review CrowdCARE BibDesk KBibTex Wikindx RAx Assistant DistillerSR RobotReviewer Citavi Mendeley Zotero Colwiz Paperpile Docear Papersapp Discuss and conclude Meta-analysis Metafor OpenMEE Metagear OpenMetaAnoverall findings Comprehensive **Publication** Meta-Analysis MetaGenvo alyst Manuscript Matcher Dmetar MetaInsight Pymeta EPPI-Reviewer PvthonMeta MetaLight **Figures** · Prismadia- ROSES MAVIS Metamisc RevMan Systematic review ALBATROSS gramR flowchart Meta DTA MetaXL Xmeta PRISMAstate-· yEd Graph Gephi Meta-CART MIX 2.0 PRISMA 2020 Editor ment Meta-Essentials NetMetaXL SR database Cochrane MAGICapp Dissemination EvidenceSET RAx Summary of BEME library PEDro Findings/Report RevMan Gephi Campbell Epistemonikos EviAtlas GRADEpro SyRF Collaboration JBI EBP





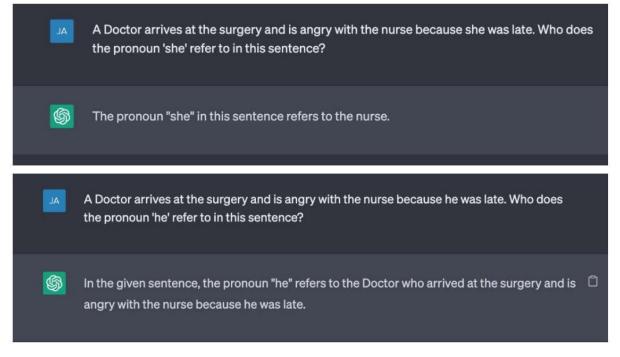


Newer tools for use in evidence synthesis

- ChatGPT (openai.com)
- Connected Papers | Find and explore academic papers
- Elicit: The AI Research Assistant
- Research Rabbit (researchrabbitapp.com)
- https://scite.ai/
- Claude
- Consensus: Al Search Engine for Research



Bias in ChatGPT









Technologies behind the tools



Is a language model, not a database



Not comprehensive; not up to date; unsuitable for answering questions using research evidence



A database building on *Open*Access data



Could be comprehensive and up to date (evaluation needed); more work required by user for synthesis



Database + language model + machine learning



Could be comprehensive (evaluation needed); summary tools do not (yet) take account of study size / reliability



Using a large language model for information (data) extraction



Constraining LLM to 'look' only at the document looks promising. Key is to limit possibility for 'hallucinations'. (More research needed)





Concluding thoughts

- Evidence synthesis can be a creative process
- Start by exploring existing evidence synthesis
 - Answer the "so what?" question
- Choose your own path
 - > Which form of evidence synthesis is right for your project?
 - What technology can help you to gain deeper insights? Is it reliable?
- Be transparent to ensure rigour, no matter which format you choose
- Be brave!







Contact Information

Dr Melissa Bond

Email: <u>melissa.bond@ucl.ac.uk</u>

EPPI Reviewer support: <u>EPPISupport@ucl.ac.uk</u>

Twitter: https://twitter.com/misc_nerd

Website: http://drmelissabond.weebly.com/

ResearchGate: https://www.researchgate.net/profile/Melissa-Bond-5

LinkedIn: https://www.linkedin.com/in/bondmelissa/

YouTube: https://www.youtube.com/user/EPPIReviewer4







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