



IQWiG Information Retrieval Meeting (IRM 2024): Software and data skills for information specialists

Introduction to OpenAlex tools for efficient automated updating of systematic reviews and maps

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Conflict of interest disclosure

I have an interest that could be perceived as a direct conflict of interest in the context and content of this training workshop:

OpenAlex tools are hosted in EPPI Reviewer

I work at the EPPI Centre and help to develop and support this not-for-profit software

- Advanced web-based software for systematic reviews and other evidence synthesis
- Ordinarily licensed on a not-for-profit, software as service, subscription basis
- Some users charged fees for access, shareable reviews, direct support or training
- Free at the point of use to all Cochrane authors for use to produce Cochrane reviews
- Open source = "coming soon" (late Summer 2024[®])

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Getting Started

EPPI-Reviewer is an application for all types of literature review, including systematic reviews, meta-analyses, 'narrative' reviews and meta-ethnographies. It is suitable for small or large-scale reviews (with some of our existing reviews containing over a million items).

Start using EPPI-Reviewer today! Sign up for a free one month trial! Please see About our fees and About support for further information.

EPPI-Reviewer subscriptions include full support via email, and we aim to respond within one working day. (We are happy to assist with the software itself and how best to use it when conducting your reviews. Contact EPPI Support for all queries.)

Cochrane

NOTE: Cochrane / Campbell reviewers can use their Archie credentials to access EPPI Reviewer at no charge. (EPPI-Reviewer is part of the developing **Cochrane** information infrastructure, being a recommended Review Production Tool). For further information click here.

EPPI Reviewer 6

EPPI Reviewer 6 is the latest version of our software, running on any modern web browser without the need for any add-ons or other installation. It works across web-enabled devices including smartphones and tablets - useful for screening on the move!

Most of our resources are now in the form of brief instructional videos and short documents covering particular functions of the

eppi.ioe.ac.uk/cms/er

News



A major new release - moving to version 6 of EPPI Reviewer, complete with Meta-Analysis functions, improved Outcome data entry, auto-comparisons and much more! See here for further details.

zotero

Zotero libraries can now be linked to your reviews, allowing you to automatically find sets of PDFs online, bulk upload and download documents to and from your reviews, etc. Details can be found here.



EPPI Reviewer has integrated access to over 200 million OA bibliographic records of research articles, connected



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	Login	Forgot Password? Create Account	t
for A	ccount and Revie	Visit the EPPI-Reviewer Gateway w Management, Documentation, Support and the RIS export utility.	Follow Us on Twitter
	For Cochrane/Ca	ampbell Authors: click HERE to login with your Cochrane account.	ore info
Latest Changes:		Version: 6.15.1.0 17 Jan 2024	
This release (V4-6.15.1.0) is a s Read More	small update whic	h marks the first step in phasing out EPPI Reviewer 4.	
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- Katya Mustafini
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About me

- EPPI Centre at University College London (UCL)
- Methods for systematic reviews and other forms of evidence synthesis → policy & practice decisions
- Automation tools and new technologies for increasing the efficiency of rigorous systematic review and evidence synthesis processes (≠ 'rapid reviews')





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	Login	Forgot Password? Creat	te Account	
for A	Account and Revie	Visit the EPPI-Reviewer Gateway w Management, Documentation, Support and the RIS export	utility.	Sellow Us on Twitter
	For Cochrane/Ca	ampbell Authors: click HERE to login with your Cochrane ad	ccount. Mor	re info
Latest Changes:		Version: 6.15.1.0 17 Jan	2024	
This release (V4-6.15.1.0) is a Read More	small update whic	h marks the first step in phasing out EPPI Reviewer 4.		
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https://eppi.ioe.ac.uk/cms/er



About you

- Ever seen EPPI Reviewer?
- Ever used EPPI Reviewer?
- Regular user of EPPI Reviewer?
- Ever seen or used OpenAlex tools?





LOCL

Outline

- 1. Introduce OpenAlex tools (~15 mins)
- Demonstrate OpenAlex tools for updating an IQWiG evidence search (~30 mins)
- 3. Try to answer your questions! (~15 mins)





Systematic reviews



"The latest research shows that we really should do something with all this research."

This Photo by Unknown Author is licensed under CC B

- Identify, appraise and synthesize <u>all</u> the evidence (research studies) that meets pre-specified eligibility criteria to <u>answer a</u> <u>specific research question</u>
- Explicit, systematic methods aimed at minimising bias, to produce more reliable findings to inform decision-making
- Stages of the SR process:
 - Formulating questions and eligibility criteria
 - Searching for eligible studies
 - Selecting eligible studies
 - Coding included study characteristics & extracting data
 - Assessing risk of bias / quality of included studies
 - Synthesising data from included studies
 - Assessing certainty of evidence
 - Interpreting results and summarising findings



UCL

Evidence and gap maps



"The latest research shows that we really should do something with all this research."

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- Identify and describe a representative majority of (<u>almost all</u>) the evidence that meets pre-specified eligibility criteria to provide <u>an</u> <u>overview of a broad area of research</u>
- Use explicit, systematic methods aimed at minimising bias, to produce more reliable findings to inform decision-making
- Stages of the mapping (EGM) process:
 - Formulating questions and eligibility criteria
 - Searching for eligible studies
 - Selecting eligible studies
 - Coding included study characteristics & extracting data
 - Assessing risk of bias / quality of included studies ???
 - \odot Synthesising data from included studies
 - → Assessing certainty of evidence
 - <u>Visualising</u> results and summarising findings



Automating evidence synthesis

- Conventional evidence synthesis production processes, undertaken manually, are time and resource intensive
- They can therefore take a long time to produce, making it difficult to 'land' evidence at the 'point' of decisions
- Findings can also become quickly out of date especially where bodies of evidence are rapidly emerging
- More efficient = reducing time and costs, while maintaining rigor and reliability (≠ 'rapid reviews') 'earning the grounds for the evidence claims'







Keeping living reviews & maps up to date



- Increasing awareness of the need to keep evidence synthesis up to date
- Evidence is rapidly emerging, current knowledge is uncertain, new research might change policy or practice
- Requires continual evidence surveillance
- Need for living evidence synthesis (capacity and tools!) was highlighted during the COVID-19 pandemic

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https://eppi.ioe.ac.uk/cms/Projects/DepartmentofHealthandSocialCare/Publishedreviews/COVID-19Livingsystematicmapoftheevidence/tabid/3765/Default.aspx

Enablers of a new generation of digital (living) evidence synthesis tools







Increased availability of open access research

Increased computing power (both memory + compute) Advances in machine learning technology

Automation \approx semi-automation







Standard information retrieval workflow for updating an (L)SR

Automation tools for study identification









Large 'network graph' dataset comprising >250M bibliographic records of research articles from across science



Open access – updated daily

Close-to-comprehensive coverage of journal articles



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Key gaps for SRs and related use scenarios

Trials registry records Conference abstracts Dissertations and Theses Grey literature





Current stats

Last updated Tue Apr 23 2024

252M Works	(j)	Second Authors	(i)	255K Sources	(j)
56M Open Access works 31M from the Global South		5M with ORCIDs 12M from the Global South		45K that are Open Access	
4M datasets					
10K Publishers	(j)	32K Funders	(j)	108K Institutions	(j)
S 65K Concepts	(i)	SK Topics	(j)	Subfields	(i)
26 Fields	(j)	C 4 Domains	(j)	17 Sdgs	(j)
S 247 Countries	i	S 7 Continents	i	¾ 184 Languages	(j)
18 Types	(i)	6 Source-Types	(j)	8 Institution-Types	(i)

https://openalex.org/stats







Sources

OpenAlex is not doing this alone! Rather, we're aggregating and standardizing data from a whole bunch of other great projects, like a river fed by many tributaries. Our two most important data sources are <u>MAG</u> and <u>Crossref</u>. Other key sources include:

- ORCID
- <u>ROR</u>
- <u>DOAJ</u>
- <u>Unpaywall</u>
- <u>Pubmed</u>
- Pubmed Central
- <u>The ISSN International Centre</u>
- Subject-area and institutional repositories from <u>arXiv</u> to <u>Zenodo</u> and everywhere in between. You can get the full list of sources <u>using our API</u>.





Ð	OpenAlex	
	Explore	
i	About	^
	Overview	
	Testimonials	
	Coverage stats	
	Learn more	~
Q	Connect	~
	Upgrade	

Comparison with other scholarly data sources

How does OpenAlex compare to other scholarly data sources like Dimensions, Scopus, Google Scholar, etc.?

That is a big question! There are many ways to measure this, and we encourage you to try out the different options to see what is best for you.

Here we offer a comparison of some of the different options available, across just a few aspects:

	Number of works	Open Access works	Citations	Price	Data Openness	Org structure
<u>OpenAlex</u>	243M	48M	1.9B	Freemium	Fully open, CC0 license	Non-profit
<u>Scopus</u>	87M	20.5M (<u>ref</u>)	1.8B	Subscription	Closed	For Profit
<u>Web of Science</u> (core)	87M (<u>ref</u>)	12M (<u>ref</u>)	1.8B	Subscription	Closed	For Profit
Dimensions	135M	29M (<u>ref</u>)	1.7B	Freemium	Partly open, personal use	For Profit
<u>Google Scholar</u>	389M (<u>estimated</u>)	?	?	Free	Closed	For Profit
<u>Crossref</u>	145M	20M	1.45B	Free	Fully open, CC0 license	Non-profit

https://openalex.org/about

Automation tools for study identification





Automation tools for study identification







OpenAlex methods research questions

- 1. Does OpenAlex contain the study reports we need to identify for systematic reviews, maps and other evidence syntheses? (*Recall*)
- Can we use OpenAlex to efficiently identify the study reports we need for systematic reviews, maps and other evidence syntheses? (*Precision*)

OpenAlex = A large knowledge graph for open access research





Knowledge graphs for open access research





Knowledge graphs for open access research



Report ('Work') 1

Report ('Work') 2



Knowledge graphs for open access research



Report ('Work') 1

Report ('Work') 2



OpenAlex = A large knowledge graph for open access research

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ightarrow $ ightarrow$ $ ightarrow$ docs.openalex.or	g	☆ ひ ± 🕕 :
OpenAlex technical documentation		Q Search St + K
Overview Quickstart tutorial	Overview	Data Access
API ENTITIES		Why OpenAlex?
Entities overview		Contact
Works	OpenAlex	Citation
O Authors		⊕ Export as PDF
sources	> OpenAlex is a fully open catalog of the global research system. It's named after the ancient Library	
Institutions	 of Alexandria and made by the nonprofit OurResearch. 	
P Topics	>	
Publishers	This is the technical documentation for OpenAlex , including the OpenAlex API and the data snapshot . Here, you can learn how to set up your code to access OpenAlex's data. If you want to	
Funders	 explore the data as a human, you may be more interested in OpenAlex Web. 	
9 Geo	>	
Concepts	Data	
OW TO USE THE API		
PI Overview	The OpenAlex dataset describes scholarly <u>entities</u> and how those entities are connected to each other. Types of entities include works, authors, sources, institutions, topics, publishers, and funders.	
et single entities		
Get lists of entities	Together, these make a huge web (or more technically, heterogeneous directed <u>graph</u>) of hundreds of millions of entities and billions of connections between them all.	
Powered by GitBook		



OpenAlex = A large knowledge graph for open access research







OpenAlex methods research questions

- 1. Does OpenAlex contain the study reports we need to identify for systematic reviews, maps and other evidence syntheses? (*Recall*)
- Can we use OpenAlex to efficiently identify the study reports we need for systematic reviews, maps and other evidence syntheses? (*Precision*)



OpenAlex methods research questions

- 1. Does OpenAlex contain the study reports we need to identify for systematic reviews, maps and other evidence syntheses? (*Recall*)
- Can we use <u>machine learning tools to exploit the network graph and</u> <u>text features of</u> OpenAlex <u>records</u> to efficiently identify the study reports we need for systematic reviews, maps and other evidence syntheses? (*Precision*)



OpenAlex auto-update model for continual updating of larger Cochrane Reviews





Table 1: Dataset statistics			
Num. unique reviews	644		
Num. review domains	52		
Num. unique publications	14574		
Min publications per review	40		

Table 2: **Experimental results.** Rows correspond to model runs with a certain set of features. Columns represent the best result for a certain threshold, in terms of the best precision with 0.97 recall. Training time is measured over a cloud virtual machine with a single GPU.

#	Features	Precision @97	Recall	Training time	
	Baseline				
1	Auth-Cit-Tit	.593	.996	na	
2	Auth-Cit-Tit-Abs	.352	.999	na	
3	Auth-Cit-Tit-Abs-FoS-UMLS	.909	.988	2h29'	
	With embeddings				
4	Auth-Cit-Tit-eTit	.947	.983	<mark>5h4</mark> 3'	
5	Auth-Cit-Tit-eTit-Abs-eAbs	.96	.979	9h59'	
6	Auth-Cit-Tit-eTit-Abs-eAbs-FoS-UMLS	.888	.989	na	

doi.org/10.2139/ssrn.4406117



Automated OpenAlex searches with other ML tools for continual updating of a living map of COVID-19 research

	Q Search records_ Title and Abstract	Home All records Logout
Listrecords Frequencies	COVID-19: Living map of the evidence	The ball Alexe Research Represent Research Index a solidarithm balance the following Internet Internet The Solitonia Internet Internet Internet Internet Internet Internet Internet Internet Internet Int
Treatment evaluation Transmission / risk / prevalence	Introduction	+ Publications by year +
Diagnosis Health impacts Vaccine development	Frequencies: Topic	- Maps(3D) & Crosstabs(2D) +
Treatment development Genetics / biology	🗄 Toole 🔛 Edd Gar 📢 Pier 🌐 Toole (new page) 🕒 Sove	
Case reports (patients) Case study - organisation	Transmission / risk / prevalence Diagnosis	
Social / economic / indirect impacts	Health impacts Vaccine development Treatment development	
Version	Case reports (patients) Case study - organization	
All versions Version 106 - 10th October 2023	Social / economic / indirect impacts Mental health impacts 0 10000 20000 30000 40000 50000 60000 70000 80000 9	
Version 105 - 12th July 2023	Let Show encoded	
EPPI-Vis is de	veloped and maintained by the EPPI-Centre. The data shown is retrieved in real time from the EPPI-Reviewer database.	CPP







doi.org/10.12688/wellcomeopenres.17141.1




Further rigorous evaluations needed spanning a wide range of (L)SRs and (living) maps!







OpenAlex tools in EPPI Reviewer

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Reviewer		Update re	view	E	Feedback Help Support Ian She	milt Logout		
+ Bring up-to-date	Keep up-to-date Match reco	ords Search and browse Sele	ected Show History			Close/back		
		Autoupdate las	st run on: 2024-03-29 Matched items: 0					
To use the 'Update review' functions (Bring up-to-date and Keep up-to-date) you must first match the references in your review with their equivalent record in OpenAlex. Please click on Run matching algorithm in the match records area to start the matching process.								
Run matching algorithm Clear all matches in review Clear all non-manual matches in review								
	-							
	-			Records that could not be matched	Records that are no I matched	longer		
Run matching algorithm Cl	ear all matches in review Clear All matched excluded	all non-manual matches in review All matched records in	C Low confidence matched		matched	longer		
Run matching algorithm Cl All matched included records	lear all matches in review Clear All matched excluded records	all non-manual matches in review All matched records in review	C Low confidence matched items	matched	matched	longer		
Run matching algorithm Cl All matched included records	ear all matches in review Clear All matched excluded records 0 (List Papers)	all non-manual matches in review All matched records in review	C Low confidence matched items	matched	matched	onger		

See eppi.ioe.ac.uk/cms/Default.aspx?tabid=3754 for further details



OpenAlex and ML tools for automated study identification









Auto-update

Problem Formulation

The domain entities are **papers** and **reviews**. Specifically, a review comprises a curated collection of papers that are relevant to a certain scientific question. The task is about recommending brand new papers to reviews owners based on their relevance to the scientific questions. More formally, the problem to address is the following:

Given a set of reviews R, a set of papers P_r for each review $r \in R$ and a set of new papers P_{new} , the task is about finding a set of pairs (p, r) such that $p \in P_{new}$, $r \in R$ and p is relevant to r based on P_r .



Review1: "Empirical studies in Pair Programming for CS/SE Teaching in Higher Education" **Review2**: "Interventions for recruiting smokers into cessation programmes" **Review3**: "Immunotherapy (oral and sublingual) for food allergy to fruits"

devblogs.microsoft.com/ise/developing-and-deploying-a-recommender-model-for-continuous-systematic-literature-reviews



Auto-update – ML model technical details



doi.org/10.2139/ssrn.4406117





Auto-update – ML model technical details



devblogs.microsoft.com/ise/developing-and-deploying-a-recommender-model-for-continuous-systematic-literature-reviews





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Network graph search – three modes











DOI: 10.60584/V22-06A

- Recent IQWiG evidence search for the S3 guideline on diagnosis and treatment of gout (v1.0)
- Search is for diagnosis (not treatment): reports of studies of accuracy of various procedures for diagnosing gout among adult patients with suspected gouty arthritis
- Conventional searches for primary studies:
 - Ovid MEDLINE(R) ALL 1946 to April 21, 2023
 - CENTRAL (The Cochrane Library): Issue 4, April 2023
 - **2 x CTRs**
- Hypothetical use scenario = Update this evidence search using OpenAlex tools only: April 2023 to present day

https://www.iqwig.de/en/projects/v22-06.html

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Tabelle 1: Übersicht über die Kriterien für den Studieneinschluss

Einschlusskriterien

- E1 Population: erwachsene Patientinnen und Patienten mit Verdacht auf eine Gichtarthritis
- E2 Indextests:
 - klinischer Diagnosescore (Gicht-Kalkulator), Cut-off: 8 [8]
 - DECT
 - Röntgen
 - Ultraschall
 - Doppelkontur-Zeichen und / oder Tophus^a gemäß der OMERACT-Definition [9] jegliche Auffälligkeit
 - Doppelkontur-Zeichen und / oder Weichteil-Ansammlungen von Natriumuratkristallen und / oder Tophi^a – jegliche Auffälligkeit
 - Doppelkontur-Zeichen und / oder Schneesturm-Erscheinungsbild und / oder Tophus^a jegliche Auffälligkeit
 - ACR- / EULAR-Klassifikationskriterien, Cut-off: 8 [10]
 - Es werden ausschließlich Indextests herangezogen, die den Referenztest nicht beinhalten.
- E3 Referenztest: mikroskopischer Nachweis von Natriumuratkristallen in der Gelenkflüssigkeit oder im periartikulären Gewebe
- E4 Zielgrößen: personenbezogene Vierfeldertafel-Daten zur Berechnung der diagnostischen Güte (z. B. Sensitivität, Spezifität)
- E5 Studientyp: prospektiv geplante Querschnitts- und Kohortenstudien^b
- E6 Publikationssprache: Deutsch oder Englisch
- E7 Vollpublikation verfügbar^c

https://www.iqwig.de/en/projects/v22-06.html





https://www.iqwig.de/en/projects/v22-06.html



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GPT-4 auto-coding in EPPI Reviewer for eligibility screening

↑ Codes

Auto-Coding 1 - Eligibility Screening - Criteria Set A
Inclusion Criterion A1
Inclusion Criterion A2
Inclusion Criterion A3
Inclusion Criterion A4
Inclusion Criterion A5
Inclusion Criterion A6
Inclusion Criterion A7
Inclusion Criterion A8
Inclusion Criterion A9
Inclusion Criterion A10
Inclusion Criterion A11
Code description:
eligibility_decision_is_included_criterion_a1: boolean // Is this a report of a primary research study?

~82-85% agreement vs. human decisions (n=100)
 Recall ~0.95-0.98
 Precision ~0.86-0.87

- eligibility_decision_is_included_criterion_a1: boolean // Is this a report of a primary research study?
- eligibility_decision_is_included_criterion_a2: boolean // Is this a report of a systematic review?
- eligibility_decision_is_included_criterion_a3: boolean // Is this a report of a living systematic review?
- eligibility_decision_is_included_criterion_a4: boolean // Is this a report of a meta-analysis?



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	Password:		Ŗ			
	Login	Forgot Password? Creat	te Account			
for A	Account and Revie	Visit the EPPI-Reviewer Gateway w Management, Documentation, Support and the RIS export	utility.	Sellow Us on Twitter		
For Cochrane/Campbell Authors: click HERE to login with your Cochrane account. More info						
Latest Changes:		Version: 6.15.1.0 17 Jan	2024			
This release (V4-6.15.1.0) is a Read More	small update whic	h marks the first step in phasing out EPPI Reviewer 4.				
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The Northern Ireland Hub for Trials Methodology Research +1+1+1+ UNIVERSITY SITES / THE NORTHERN IRELAND NETWORK FOR TRIALS METHODOLOGY RESEARCH / SWAT/SWAR INFORMATION / REPOSITORIES / SWAR STORE **SWAR Store** REPOSITORIES SWAT Store SWAR Repository Store To search the SWAR list please use 'Find on this page...' (Ctrl + F) within the 'Edit' menu at the top of this page. You are welcome to SWAR Store adopt or adapt one of these if they would like to conduct a piece of embedded methodology research. SWAR Title Link (Author(s) & Date) ID 1) Citation screening in systematic reviews: Two approaches, two authors and time SWAR01 Declan Devane (2022 Aug taken 25 1552) 2) Effects of reading a written summary or listening to a summary podcast on SWAR02 Mike Clarke (2013 JUL 19 knowledge and understanding of the findings of a systematic review. 1210)

To investigate whether supplying Cochrane Eyes and Vision review author teams SWAR 03 Jennifer Evans and

https://www.qub.ac.uk/sites/TheNorthernIrelandNetworkforTrialsMethodologyResearch/SWATSWARInformation/Repositories/SWARStore/





New SWAR Registration – Forthcoming (Draft)

1. To assess the effectiveness and efficiency of conducting automated searches of the OpenAlex dataset – using OpenAlex tools in EPPI-Reviewer – compared with conventional electronic searches of multiple literature databases, for continual or regular updating of (living) systematic reviews.

2. To assess the effectiveness and efficiency of using bespoke, binary machine learning classifiers – trained, calibrated, evaluated and deployed using machine learning tools in EPPI-Reviewer – to automatically exclude some records prior to the citation (title-abstract) screening stage, compared with screening all citations, for continual or regular updating of (living) systematic reviews.