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Introduction to new random-effects methods in RevMan

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To introduce the new random-effects methods being implemented in RevMan

Outline

- Process used to develop the recommendations for the random-effects metaanalysis methods
- Recap the random-effects model
- Outline the new random-effects methods, recommendations for when to use them (and why), and how they may impact the results (via example)
 - Heterogeneity estimator (and confidence interval method)
 - Confidence interval method for the summary mean effect
 - Prediction interval
- What to write in a protocol
- Questions



Created by Berkah Icon from Noun Project

Process used to develop and implement recommendations

Updated systematic reviews of statistical simulation studies examining the performance of heterogeneity estimators and CI methods for summary effect size [Veroniki 2016, Veroniki 2019]

Examined the impact of adopting different methods when applied to meta-analyses in the Cochrane Library

Convened multiple meetings to review and discuss the evidence and form recommendations

Submitted recommendations and evidence to the Methods Executive (Jan 2022) Cochrane endorsed the recommendations (Sep 2022) Revision of recommendations (May 2024) *Team developing recommendations:*

- Areti-Angeliki Veroniki | Unity Health Toronto, University of Toronto
- Dean Langan | University College London
- Simon Turner | Monash University
- Mark Simmonds | University of York
- Anna Chaimani | Université Paris Cité
- Kerry Dwan | formally Cochrane
- Joanne McKenzie | Monash University

Experience:

- Co-convenors of the Cochrane Statistical Methods Group
- Led systematic reviews of statistical simulation studies, and undertaken simulation studies, examining random-effects methods
- Led empirical evaluations examining the impact of using different methods
- Cochrane Methods Support Unit Lead and Statistical Editor

Process used to develop and implement recommendations

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Current - 2023

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Integration of the methods into RevMan

Implementation activities (e.g. updating Chapter 10 Cochrane Handbook, webinars, training materials, workshops)

Cochrane Methods Implementation Editor:

Ingrid Arévalo-Rodriguez

Cochrane IT development and Infrastructures:

- Rebecka Hall | RevMan Product Owner
- Gert van Valkenhoef | Head
- Rasmus Moustgaard | Senior Systems Architect
- + Others

Specialist statistical advice from:

- Julian Higgins | University of Bristol
- Wolfgang Viechtbauer | metafor package creator

Cochrane Statistical Methods Group links:

- Areti-Angeliki Veroniki | Unity Health Toronto, University of Toronto
- Joanne McKenzie | Monash University

Testing:

Simon Turner | Monash University

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Random-effects meta-analysis



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Random-effects meta-analysis model

Log odds ratio

Intravenous immunoglobulin (iVIG) for Guillain - Barre syndrome (GBS)

		r	n	r n			
	Author(s)/study ID	Co	ntrol	Treatment	Favours control	Favours treatment	Log odds ratio [95% CI]
	Nomura	1	24	1 23			0.04 [-2.79 , 2.88]
	PSGBS	18	121	3 130	— ———————————————————————————————————		-2.00 [-3.25 , -0.75]
The choice of the method for estimating		0	24	0 26			-0.08 [-4.04 , 3.88]
 between-study variance 	Meche	12	73	0 74			-3.41 [-6.26 , -0.56]
(heterogeneity) and its uncertainty	- Hanszeal (Initial)					<u>∻</u> 2	-2.21 [-3.26 , -1.15]
• uncertainty for the	nonian - Laird			$(\tau_{dl} = 0.606)$			-1.70 [-2.99 , -0.42]
summary effect size	g - Makambi			(τ _{hm} = 0.867)			-1.65 [-3.12 , -0.18]
is important when conducting a meta-analysis	ed Paul - Mandel			(τ _{ipm} = 1.582)		0 0 0 0 0 0 0 0 0 0 0 0	-1.54 [-3.57 , 0.50]
	um likelihood			$(\tau_{ml} = 0.003)$	-		-1.79 [-2.81 , -0.76]
	's Bayes positive			$(\tau_{rbp} = 1.335)$		• • •	-1.57 [-3.40 , 0.27]
used, this can seriously jeopar	are dize ^{ted maximum likeliho}	bod		$(\tau_{reml} = 0.003)$			-1.79 [-2.81 , -0.76]
results, leading to inappropriate conclusions	e Jonkman			(τ _{sj} = 1.135)			-1.60 [-3.28 , 0.08]
					-4.49 -3.00 -1.39 0.0	00 1.39 2.76 4.13	

Under the random-effects model, we can estimate a number of parameters and calculate several statistics, including:

- Average (summary) effect (µ), along with a CI
- Between-study variance $(\hat{\tau}^2)$, along with a CI
- **Prediction interval** (predicted range for the true treatment effect in an individual study)

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• + others (e.g., *I*², *H*²)

Random-effects meta-analysis model

Research

Synthesis Methods

- DerSimonian & Laird (DL) is the frequently random-effects meta-analysis method used
- DL is a method of moments estimator of τ^2
- The Wald-type normal distribution is used to calculate a CI for the summary effect
- DL with the Wald-type normal distribution is the only random-effects method implemented in RevMan
- Different estimators of heterogeneity (\(\tau^2\)) and methods to calculate uncertainty in the summary effect exist

Invited Review

(wileyonlinelibrary.com) DOI: 10.1002/jrsm.1164

• For any particular meta-analysis, the estimated parameters (e.g. summary effect, heterogeneity variance) may differ depending on the method used

Work conducted on behalf of the Cochrane Statistical Methods Group



Areti Angeliki Veroniki,^a* Dan Jackson,^b Wolfgang Viechtbauer,^c Ralf Bender,^d Jack Bowden,[°] Guido Knapp,^f Oliver Kuss,⁹ Julian PT Higgins,^{h,i} Dean Langanⁱ and Georgia Salanti¹

Meta-analyses are typically used to estimate the overall/mean of an outcome of interest. However, inference about between-study variability, which is typically modelled using a between-study variance parameter, is usually an additional aim. The DerSimonian and Laird method, currently whicky used by the study of t Which is the most appropriate method to use?



Received: 9 November 2017 Revised: 23 May 2018 Accepted: 13 August 2018
DOI: 10.1002/invm.1319

RESEARCH ARTICLE

WILEY Research Synthesis Methods

Methods to calculate uncertainty in the estimated overall effect size from a random-effects meta-analysis

¹Li Ka Shing Knowledge Institute, St. Michael's Hospital, Toronto, Canada ²Department of Primary Education,

Meta-analyses are an important tool within systematic reviews to estimate the overall effect size and its confidence interval for an outcome of interest. If het-

Updating RevMan





🚺 The estimated heterogeneity (Tau²) is 0.01. Cochrane's guidance is to use the Hartung-Knapp-Sidik-Jonki

Random-effects methods implemented in RevMan



1. Inference on the heterogeneity



Inference on the heterogeneity



Recommendations based on published studies

 $k \leq 10$

An empirical study using 57,397 Cochrane meta-analyses with $k \ge 2$ showed that: \rightarrow The mean τ^2 is higher than generally assumed but fails to be detected, especially for small k! Kontopantelis et al. 2013

A descriptive analysis of Cochrane systematic reviews found that 75% of metaanalyses contained 5 or fewer studies

The majority of the pairwise meta-analyses have:

Problem for Cochrane reviews \rightarrow few studies

e.g. Langan 2015 median 4 [IQR 3-7] ٠

Turner et al 2012 Pullenavegum et al 2011 Rhodes et al 2014



Davey et al. 2011

Implications with different estimators for heterogeneity

According to simulation and empirical findings, the main factors (among others) that may affect the between-study variance estimation are:

- Number and size of studies included in the meta-analysis
- Magnitude of true heterogeneity
- Frequency of events (for dichotomous outcomes)



DL often underestimates heterogeneity (particularly when the number of studies is small)

Acupuncture for dysmenorrhoea



The amount of between-study variance can be estimated, but estimates are usually imprecise

Obtain a CI for τ^2 !

Smith et al CDSR 2016: https://doi.org/10.1002/14651858.CD006930.pub3

95% CI for \hat{r}^2 : [0.824, 19.515]

Simulations have shown that REML provides more accurate estimates with less bias



Bowden et al. BMC Medical Research Methodology 11: 41, 2011. DOI:10.1186/1471-2288-11-41

DL frequently estimates tau=0



When the number of studies increases DL tends to agree with REML

Aversive smoking for smoking cessation



In case of rare events, both DL and REML tend to underestimate heterogeneity

All-cause mortality in antipsychotics

Long-acting injectable antipsychotics (LAI-AP) vs Placebo



Kishi et al Schizophr Bull 2016;42:1438–45

For very few studies both DL and REML tend to underestimate heterogeneity



For very few studies both DL and REML tend to underestimate heterogeneity but usually REML performs best



Confidence interval for Tau²

95% CI for $\hat{\tau}^2$: [0.000 12.707]

For very few studies both DL and REML tend to underestimate heterogeneity but usually REML performs best (particularly when heterogeneity is high)



Confidence interval for Tau²

95% CI for $\hat{\tau}^2$: [0.039 2.391]

2. Inference on the summary mean effect



Inference on the summary mean effect



WT depends on the number of studies (For few studies the CIs for µ are too narrow)



HKSJ on average produces wider CIs, but captures the true summary effect

Acupuncture for dysmenorrhoea



Smith et al CDSR 2016: https://doi.org/10.1002/14651858.CD006930.pub3

In the absence of heterogeneity: HKSJ < WT

Alcohol-related problems: up to 3 months

Social norms (SN) vs control

	Intervention		Contro	ol 🛛		Mean Difference	Mean Diffe	rence
Study	Mean SD	Total	Mean SI) Total	Weight	IV, Random, 95% C	I IV, Random,	95% CI
Lewis 2008	2.33 3.8400	97	2.64 3.890	0 90	20.0%	-0.31 [-1.42; 0.80]		
Walters 2000	4.86 3.4800	14	6.00 3.190	0 11	3.6%	-1.14 [-3.76; 1.48]		
Werch 2000	2.20 3.1000	255	2.70 4.000	0 266	65.4%	-0.50 [-1.11; 0.11]		
Ju√°rez 2006	4.28 4.2100	21	5.60 5.080	0 20	3.0%	-1.32 [-4.18; 1.54]		
Geisner 2007	5.24 7.8900	88	5.03 8.530	0 89	4.2%	0.21 [-2.21; 2.63]		
Collins 2002	7.91 5.6900	47	7.83 6.670	0 47	3.9%	0.08 [-2.43; 2.59]		
Random effects model (Wald type) Random effects model (HKSJ)		522 522		523 523	100.0%	-0.46 [-0.95; 0.04] -0.46 [-0.77; -0.14]	-	$\hat{\tau}^2 = 0.00$
Heterogeneity: $Tau^2 = 0$; Chi ² = 1.16,	df = 5 (P = 0.9	$5); ^2 = ($	0%	020	100.070	-0.40 [-0.11, -0.14]	-4 -2 0	2 4

Favours Intervention Favours Control

Wald Type 95% CI:
$$\hat{\mu} \pm 1.96\sqrt{var_{WT}(\hat{\mu})}$$

[-0.46 ± 1.96* $\sqrt{0.06}$]
[-0.95, 0.04]

HKSJ 95% CI: $\hat{\mu} \pm t_{k-1,0.975} \sqrt{var_{HKSJ}(\hat{\mu})}$ [-0.46 ± 2.57* (0.015] [-0.77, -0.14]

Foxcroft et al CDSR 2015: https://pubmed.ncbi.nlm.nih.gov/25622306/

In the absence of heterogeneity: HKSJ < WT (Irrespective of the number of studies)

Respiratory distress syndrome

Sotiriadis et al CDSR 2018: https://pubmed.ncbi.nlm.nih.gov/30075059/

Antenatal corticosteroids vs no steroids

	Interventio	n Control		Odds Ratio	Odds Ratio	
Study	Events Tota	I Events Total	Weight	Random, 95% Cl	Random, 95% Cl	
Stutchfield 2005	3 6	6 1 73	7.1%	3.43 [0.35; 33.80]		
Ahmed 2015	6 3	6 2 40	13.2%	3.80 [0.72; 20.19]		
Nooh 2018	8 30	7 299	35.0%	1.14 [0.41; 3.18]		
Nada 2016	10 61	4 616	27.2%	2.55 [0.79; 8.16]		
Ahmed 2015	2 7	6 0 74	4.0%	5.00 [0.24; 105.93]		
Stutchfield 2005	1 21	0 219	3.6%	3.14 [0.13; 77.59]		_
Stutchfield 2005	1 19	5 0 175	3.6%	2.71 [0.11; 66.88]		_
Nooh 2018	2 30	1 299	6.4%	1.99 [0.18; 22.10]		
Ahmed 2015	0 11	2 0 114	0.0%			
						$\hat{\tau}^2 = 0.00$
Random effects model (Wald Type)	190	3 1909	100.0%	2.11 [1.15; 3.88]	•	$\iota = 0.00$
Random effects model (HKSJ) Heterogeneity: $Tau^2 = 0$; $Chi^2 = 2.52$	1908 , df = 7 (P = 0.9	1909 3); I ² = 0%	100.0%	2.11 [1.36; 3.28]	· · · · · · ·	_
		-		0.	.01 0.1 1 10	100
				Favor	urs Intervention Favours Cor	ntrol

The **HKSJ** method is not always conservative compared to the common-effect meta-analysis! This is why the most conservative CI is always recommended to be selected

HKSJ when the number of studies is <5

Number of studies : k=4



Number of studies : k=3



Kapp et al CDSR 2010: https://pubmed.ncbi.nlm.nih.gov/20166091/

HKSJ when the number of studies is <5



In the case of 2 studies, the HKSJ can lead to overly conservative results!

In case of **rare events**, HKSJ performs worse than DL

All-cause mortality in antipsychotics



HKSJ gives comparable results to DL as the number of studies increases

Study	logHR SE	Weight I	Hazard Ratio V, Random, 95% Cl	Hazard Ratio IV, Random, 95% Cl	
1	-0.3731 0.2689	5.5%	0.69 [0.41; 1.17]		
2	0.0557 0.2802	5.1%	1.06 [0.61; 1.83]		
3	-0.5096 0.2017	8.3%	0.60 [0.40; 0.89]		
4	0.0121 0.1974	8.5%	1.01 [0.69; 1.49]		
5	0.2003 0.3630	3.3%	1.22 [0.60; 2.49]		
6	-0.5270 0.2506	6.1%	0.59 [0.36; 0.96]		
7	-0.1773 0.1883	9.1%	0.84 [0.58; 1.21]		
8	-0.4391 0.1845	9.3%	0.64 [0.45; 0.93]		
9	0.0525 0.5000	1.9%	1.05 [0.40; 2.81]		
10	-0.1385 0.5547	1.5%	0.87 [0.29; 2.58]		
11	-0.0577 0.3503	3.5%	0.94 [0.48; 1.88]		
12	-0.4062 0.3922	2.9%	0.67 [0.31; 1.44]		
13	-0.3797 0.2176	7.5%	0.68 [0.45; 1.05]		
14	-0.0769 0.1583	11.2%	0.93 [0.68; 1.26]		
15	0.1655 0.4862	2.0%	1.18 [0.45; 3.06]		
16	0.0955 0.3925	2.9%	1.10 [0.51; 2.37]		
17	-0.7667 0.2216	7.3%	0.46 [0.30; 0.72]		
18	-0.7947 0.3204	4.1%	0.45 [0.24; 0.85] -		WT: [0.66, 0.87]
Random effects model	(WT)	100.0%	0.76 [0.66: 0.87]	•	
Random effects model (Heterogeneity: Tau ² = 0.020	(HKSJ) D1; Chi ² = 20.83, df = 17	100.0% (P = 0.2341	0.76 [0.66; 0.88]); I ² = 18.4%	▲	HKSJ: [0.66, 0.88]
				0.5 1 2	
			Favou	rs Intervention Favours Control	
				Hazard Ratio (Cervix2)	



Estimates with 95% confidence intervals

Estimates with 95% confidence intervals

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Source: Julian Higgins

Prediction intervals for random-effects meta-analysis



• Tau² = estimated between-study variance, SE² = estimated 'typical' within study variance, HKSJ = Hartung-Knapp and Sidik-Jonkman



Prediction Intervals for random-effects meta-analysis

A 95% prediction interval where approximately 95% of the true treatment effects are predicted to fall is:





 Summary of the spread of underlying effects in the studies included in the meta-analysis

Confidence Interval

Calculation of a prediction interval

An approximate 95% range of normally distributed underlying effects can by obtained by: $\hat{\mu}_{RE} \pm 1.96\sqrt{\tau^2}$

But, in practice, both the summary estimate (μ) and τ are estimated, which needs to be accounted for when calculating the prediction interval:

 $\hat{\mu}_{RE} \pm m \sqrt{\hat{\tau}^2 + var(\hat{\mu}_{RE})}$



Calculation of a prediction interval

An approximate 95% range of normally distributed underlying effects can by obtained by: $\hat{\mu}_{RE} \pm 1.96\sqrt{\tau^2}$

But, in practice, both the summary estimate (μ) and τ are estimated, which needs to be accounted for when calculating the prediction interval:

 $\hat{\mu}_{RE} \pm m\sqrt{\hat{\tau}^2 + var(\hat{\mu}_{RE})}$

Choice of multiplier (m) is dependent on the confidence interval method used for the summary estimate

- Wald-type CI method \rightarrow z quantile for PI
- HKSJ CI method \rightarrow *t*-distribution with k-1 degrees of freedom

This choice of multiplier means that in the absence of observed heterogeneity, the CI and PI will be identical ³⁸

Prediction Interval example

Studies		Hazard Ratio [95% CI]	Does the treatment reduce the risk of having an event? Does the effect size vary across studies?
Study 1		1.45 [1.08, 1.96]	Statios.
Study 2	—	0.58 [0.29, 1.16]	
Study 3	⊢ ∎ ∺	0.87 [0.64, 1.20]	
Study 4	⊢ ∎ -1	0.82 [0.60, 1.11]	
Study 5	⊢ ∎ –į́	0.67 [0.46, 0.97]	Calculation of Prediction Interval:
Study 6	·	1.17 [0.57, 2.38]	
Study 7	—	1.17 [0.74, 1.84]	$-0.27 \pm 1.96 \sqrt{0.40^2 + 0.14^2}$
Study 8	⊢ ∎	0.72 [0.43, 1.20]	[-1.10, 0.56]
Study 9	⊢ ∎ ÷	0.83 [0.58, 1.18]	
Study 10	⊢ ∎1	0.45 [0.29, 0.71]	Back-transformed Prediction Interval
Study 11		0.20 [0.10, 0.44]	[0.33, 1.75]
RE Model	H	0.76 [0.58, 1.00]	
Q(10) = 39.63, p<0.0001		Log(HR) = -0.27 [-0.55, 0.00]	→ Log-transformed
$\hat{\tau} = 0.40$	0.05 0.14 0.57 1 2.72	z = -1.95, p=0.051	(Cochrane)
l ² = 78%	Hazard Ratio		39

Prediction Interval example



Prediction Interval example

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Hazard Ratio

Example using the recommended methods

Effect of quality improvement strategies for coordination of care on hospital admissions



Odds ratios less than 1.0 indicate decreased odds of admission to hospital

What to write in a protocol?

PRISMA 2020 - item 13d

Describe any methods used to synthesise results and provide a rationale for the choice(s). If meta-analysis was performed, **describe the model(s)**, **method(s) to identify the presence and extent of statistical heterogeneity**, **and software package(s) used**

Essential elements (some):

If meta-analysis was done, specify:

- the meta-analysis model (fixed-effect, fixed effects, or random-effects) and provide rationale for the selected model
- the method used (such as Mantel-Haenszel, inverse-variance)
- any methods used to identify or quantify statistical heterogeneity (such as visual inspection of results, a formal statistical test for heterogeneity, heterogeneity variance (τ²), inconsistency (such as I²), and prediction intervals

What to write in a protocol?

PRISMA 2020 - item 13d (continued)

Describe any methods used to synthesise results and provide a rationale for the choice(s). If meta-analysis was performed, **describe the model(s)**, **method(s) to identify the presence and extent of statistical heterogeneity**, **and software package(s) used**

Essential elements (some):

If a random-effects meta-analysis model was used, specify:

- the between-study (heterogeneity) variance estimator used (such as DerSimonian and Laird, restricted maximum likelihood (REML))
- the method used to calculate the confidence interval for the summary effect (such as Waldtype confidence interval, Hartung-Knapp-Sidik-Jonkman)



What's next?

Demonstration of new random-effects methods in RevMan

There are many methods available to fit random-effects meta-analysis. However, until 2024, the only option available in RevMan has been the DerSimonian and Laird random-effects method. This method is known to have poor statistical performance in meta-analyses with characteristics commonly found in Cochrane reviews (e.g., meta-analyses with few studies). To address this issue, Cochrane is implementing new random-effects methods in RevMan. These include a new method for estimating the between-study (heterogeneity) variance, calculating the confidence interval for the summary effect, and adding prediction intervals to aid in interpreting random-effects meta-analysis findings.



WHAT'S NEXT?

In two web clinics, the presenters will provide participants with knowledge about these new methods and their implementation in RevMan. Specifically, in the first web clinic, the presenters will outline the new methods, while in this second clinic, they will demonstrate applying the new random-effects methods using RevMan.

Presenter Bios

Professor Jo McKenzie is head of the Methods in Evidence Synthesis Unit within the School of Public Health and Preventive Medicine at Monash University, Melbourne, Australia. She is Co-Convenor of the Cochrane Statistical Methods Group and an author of several chapters of the Cochrane Handbook for Systematic Reviews of Interventions.

Dr. Areti Angeliki Veroniki is a Scientist at the Knowledge Translation Program of the Li Ka Shing Knowledge Institute, St. Michael's Hospital, Unity Health Toronto, and an Assistant Professor at the University of Toronto in the Institute of Health Policy, Management, and Evaluation. She is a Co-Convenor of the Cochrane Statistical Methods Group and Co-Chair of the Cochrane Methods Executive.

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