

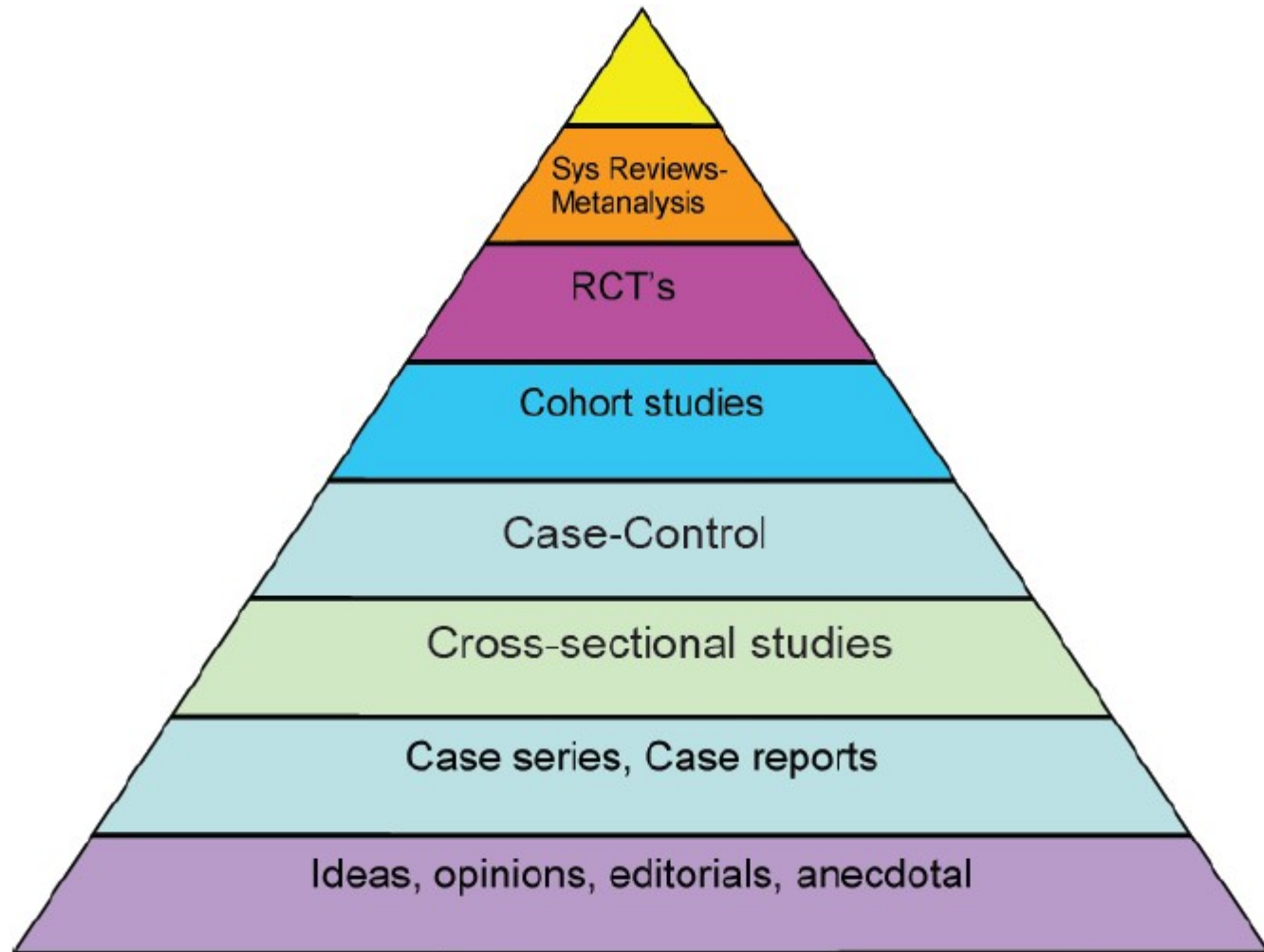
# Repeated Meta-Analysis

Pros and Cons of Multiplicity Adjustments

Martin Posch and Franz König

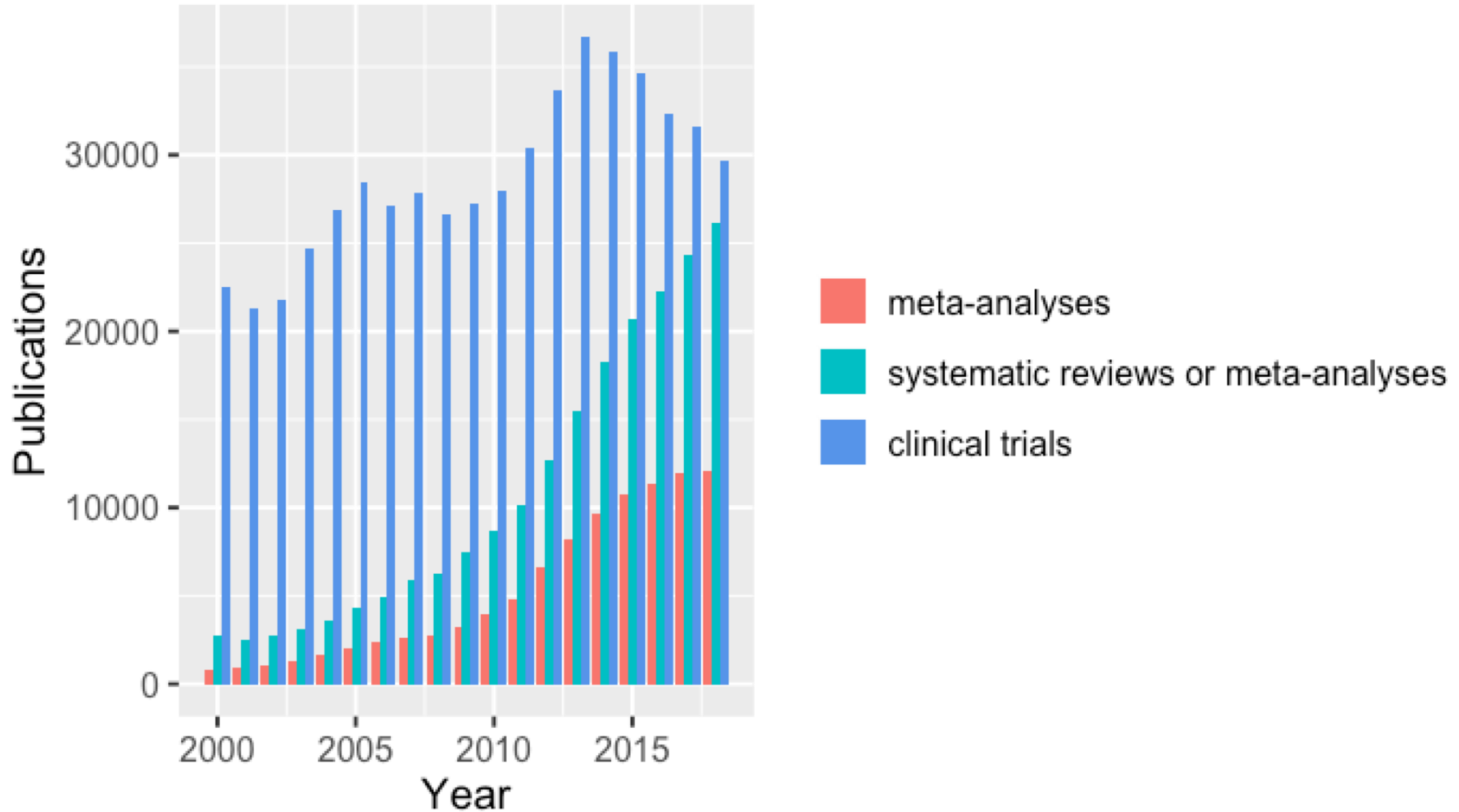
# The Pyramid of Evidence

Guyatt et al JAMA (1954)



Source: <https://blogs.bmj.com/adc/2014/11/03/the-crumbing-of-the-pyramid-of-evidence/>

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# The Mass Production of Redundant, Misleading, and Conflicted Systematic Reviews and Meta-analyses

JOHN P.A. IOANNIDIS 



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## Are systematic reviews and meta-analyses still useful research? We are not sure

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# What can go wrong with meta-analyses?

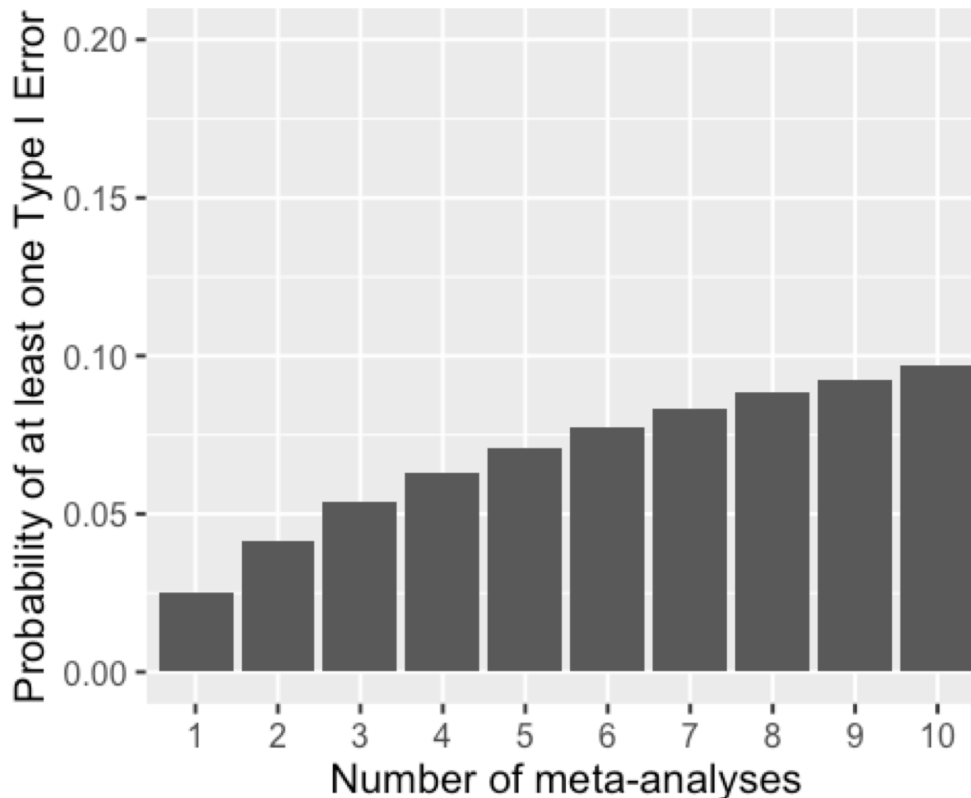
- Quality of the trials: “Garbage in – Garbage out”
- Publication bias
- Biased reporting of clinical trials (non-significant results less likely reported) (Goldacre, Nature, 2016)
- Conflicts of interest “Agenda Driven Bias”
- Meta-analyses are performed retrospectively
- Heterogeneity in analyses, inclusion exclusion criteria,....
- Underpowered meta-analyses
- Multiple meta-analyses on the same topic

# Multiple meta-analyses on the same topic

- Siontis et al (2013):
    - Of 73 meta-analyses published in 2010
      - 49 (67%) at least 1 more meta-analysis published by 2012
      - Median: 2 meta-analyses, maximum 13 meta-analyses
  - Many independent “overlapping” meta-analyses
  - Updates of meta-analyses when there are
    - new relevant methods
    - new studies
    - new information on existing included studies
- (Garner et al. 2016)

# Updating meta-analyses and Type I Error

If meta-analysis are updated and a statistical test for each update is performed, the **probability of at least one type I error** increases:



# Bias to false positive conclusions

- If meta-analyses are updated **until a significant result** is observed **and then updates are stopped** the probability to show a **statistically significant** treatment effect **approaches one**.
- To address this problem, statistical methods in analogy to group sequential trials have been developed
  - Trials sequential analysis (Wetterslev et al. 2008)
  - Sequential Meta-Analysis (Higgins et al. 2010)
  - The Law of the Iterated Logarithm (Hu et al. 2007)



# Trial Sequential Analysis (Wetterslev et al. 2008)

- A maximum information and group sequential spending function (O'Brien Fleming) is pre-specified
- After each trial cumulative z-values are computed (with random or fixed effect model)
- Critical values depend on the information fraction at the analysis points
- Information = # of patients
- Controls the Type I and Type II error rate (for random effects model not exact)

# Sequential Meta-Analysis (Higgins et al. 2010)

- In principle, similar to Trial Sequential Analysis,
- Information accounts for the heterogeneity between trials
- Bayesian estimation of information to avoid negative information increments

## Law of the Iterated Logarithm approach (Hu et al. 2007)

- No maximum information to be specified
- More conservative
- Critical values need to be adjusted by simulation
- Information accounts for the heterogeneity between trials

# Should Cochrane require adjustments for updated meta-analysis? (I)

- Status -2017: Members of Cochrane and others have developed techniques to manage Type I and II errors that can occur over time by updating and repeating meta-analyses.
- Some review authors used these techniques, Cochrane did neither encourage nor discourage their use at this point.
- Cochrane Scientific Committee recommendation (July 2017):

**“Further technical examination of these two approaches is required before the Committee can decide whether there is a preferred approach or whether the methods provide added value to managing random error. An [expert panel](#) established will discuss further and report back to the Committee before arriving at a final decision.”**

# Questions from Cochrane Scientific Committee recommendation statement/report July 2017

- “Is the problem with too little power in most meta-analysis when a required information is not reached with false positive support for the null hypothesis a sufficient problem that undermines the evidence produced by Cochrane reviews?”
- Is the problem of false positive meta-analytic conclusions due to random error introduced by underpowered meta-analysis and the probability of repeated analyses rejecting the null hypothesis a sufficient problem that undermines the evidence produced by Cochrane Reviews?
- Is the current state of development for adjustment in cumulative meta-analyses to address, specifically, type II and type I errors sufficient to recommend their implementation in Cochrane Reviews?
- If so, can the CSC recommend one or more techniques?
- If not, what further knowledge or development does the CSC need to reach a satisfactory point to decide?”

# Should Cochrane require adjustments for updated meta-analyses? (II)

Cochran Scientific Committee asked an expert panel whether Cochrane should **implement, and routinely adopt, sequential statistical** methods for its reviews

Expert Panel: **Christopher Schmid, Jackie Chandler, Stephen Senn, Jonathan Sterne, Elena Kulinskaya, Martin Posch, Kit Roes, Jo McKenzie**

**“The Expert Panel recommends against the use of sequential methods for updated meta-analyses in most circumstances within the Cochrane context. They should not be used for the main analyses, or to draw main conclusions.”**

[https://methods.cochrane.org/sites/default/files/public/uploads/tsa\\_expert\\_panel\\_guidance\\_and\\_recommendation\\_final.pdf](https://methods.cochrane.org/sites/default/files/public/uploads/tsa_expert_panel_guidance_and_recommendation_final.pdf) (2018)

# Main arguments

- Cochrane Reviews should provide the best summary of the evidence to date.  
*The overall type I error is less relevant than the type I error at a specific analysis*
- Cochrane authors should avoid binary interpretations (significant/not significant)
- A meta-analysis usually does not relate to a single decision
  - Different outcomes (benefit and harm)

# Important differences between group sequential trials and updating meta-analysis

- The meta-analyst has **no control if and which trials are performed**. Group sequential stopping rules (for futility or superiority) will not be adhered to. Maximum information can hardly be pre-specified.
- Between trial heterogeneity estimates that determine the estimated information fractions may not be reliable.
- The design of later studies will depend on the results of earlier studies – thus, a sequential meta-analysis rather resembles an adaptive trial rather than a group sequential trial.

# Tricky part

- *“Cochrane Review authors should interpret evidence on the basis of the estimated magnitude of the effect of intervention and its uncertainty (usually quantified using a confidence interval), rather than focusing primarily on the rejection of the null hypothesis of no treatment effect.”*
- If the decision to update meta-analyses depends on the results of new trials, then the actual coverage probability of the conventional 95%-confidence interval is unknown ...



# Additional comments

- Bayesian Approaches: Formal decision analytic methods integrate effects of interventions estimated using meta-analyses and network meta-analyses with costs of the benefits and harm outcomes. Such methods **are now available and are more informative for decision makers than declarations of statistical significance** (whether adjusted or not).
- Sequential approaches may be considered **in the context of a prospectively planned meta-analysis** of a series of clinical trials.
- *For retrospective meta-analyses which are planned after trial results are available, type I error rates will not be reliable if adjusted or not.*

# Conclusions of the Expert Panel

Cochrane should support the decision maker and end user by **providing the best and latest evidence, but that interpretation of that evidence should be left to the user** to make within their own context. The priority is to ensure the **decision maker is aware that the current estimate of the intervention effect may change** as further information becomes available. Most decision makers are well aware of this. Unless the evidence is overwhelmingly convincing, any decision may change or be reversed over time.

# Addressing the challenges in meta-analyses

- Quality of the trials: “Garbage in – Garbage out”
  - *Grade Approach*
- Publication Bias
  - *Trial registration, publication of trial results in the registers*
- Biased reporting of clinical trials (non-significant results less likely reported) (Goldacre, Nature, 2016)
  - *Detailed prospective protocols with analysis plans, transparency*
- Conflicts of interest “Agenda Driven Bias” - *Transparency*
- Meta-analyses are performed retrospectively
  - *Register for meta-analyses (Prospero), Prospective meta-analyses*
- Heterogeneity in analyses, inclusion exclusion criteria,....
  - *Individual-level-meta-analyses*
- Multiple updated meta-analyses on the same topic
  - *For prospective analyses multiplicity adjustment*

# Links

- <https://methods.cochrane.org/methods-cochrane/repeated-meta-analyses>
- **Cochrane Scientific Committee Recommendation statement/report (July 2017).**  
[https://methods.cochrane.org/sites/default/files/public/uploads/scientific\\_committee\\_statement\\_report\\_cumulative\\_ma\\_final\\_301017.pdf](https://methods.cochrane.org/sites/default/files/public/uploads/scientific_committee_statement_report_cumulative_ma_final_301017.pdf)
- **Expert panel consensus statement (December 2018):**  
[https://methods.cochrane.org/sites/default/files/public/uploads/tsa\\_expert\\_panel\\_guidance\\_and\\_recommendation\\_final.pdf](https://methods.cochrane.org/sites/default/files/public/uploads/tsa_expert_panel_guidance_and_recommendation_final.pdf)