

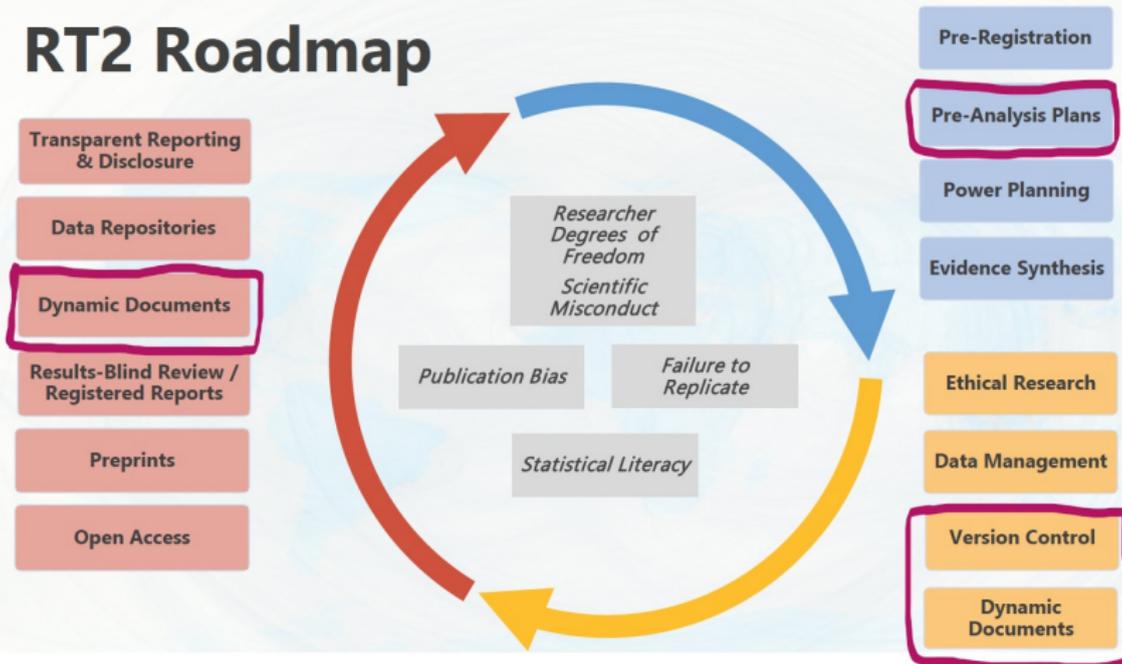
# Registration & Pre-Analysis Plans

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Filling in the gaps. An online workshop to promote, improve and implement tools for transparency and reproducibility in health economics research

23 September, 2021

# RT2 Roadmap



# Outline

- Publication bias is a problem
- Registration can help with publication bias
- Pre-analysis plans
- What should we include in our PAP, and where should we post it?

# Publication bias is a problem

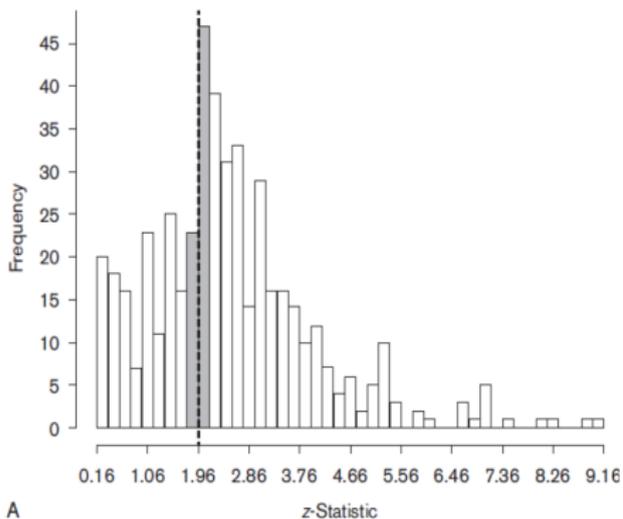
Three reasons behind:

- ① P-hacking
- ② The difficulty of publishing statistically insignificant results
- ③ The “File Drawer Problem”

## # 1) p-hacking

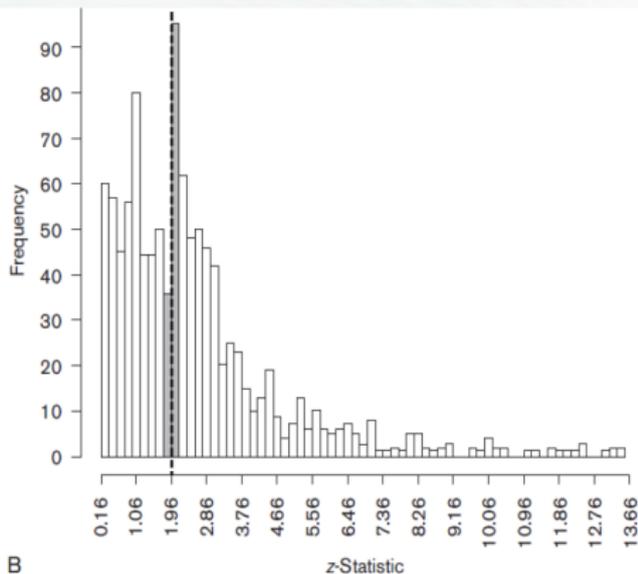
- P-hacking (fishing, researcher degrees of freedom, data mining, data massaging, data dredging, or specification searching) occurs **when researchers**, intentionally or not, **select** a subset of the possible analyses in a study **based on** whether those analyses generate **statistically significant results**
- *If we only write up/publish significant results, and we have no record of all the insignificant results, we have no way to tell if our 'significant' results are real, or if they are the 5% we should expect due to noise*(Garret, [2017](#))

## Sociology journals



A

## Political Science journals



B

Gerber and Malhotra (2008)

## p-hacking in economics?

# Methods Matter: p-Hacking and Publication Bias in Causal Analysis in Economics

Abel Brodeur

Nikolai Cook

Anthony Heyes

AMERICAN ECONOMIC REVIEW  
VOL. 110, NO. 11, NOVEMBER 2020  
(pp. 3634-60)

Brodeur et al. ([2020](#)) analysed 21,000 hypothesis tests from RCT, DID, IV and RDD research designs, published in 25 leading economic journals, and found that p-hacking is particularly concerning in IV studies

## #1) *The garden of forking paths*

**The garden of forking paths: Why multiple comparisons can be a problem, even when there is no “fishing expedition” or “p-hacking” and the research hypothesis was posited ahead of time\***

Andrew Gelman<sup>†</sup> and Eric Loken<sup>‡</sup>

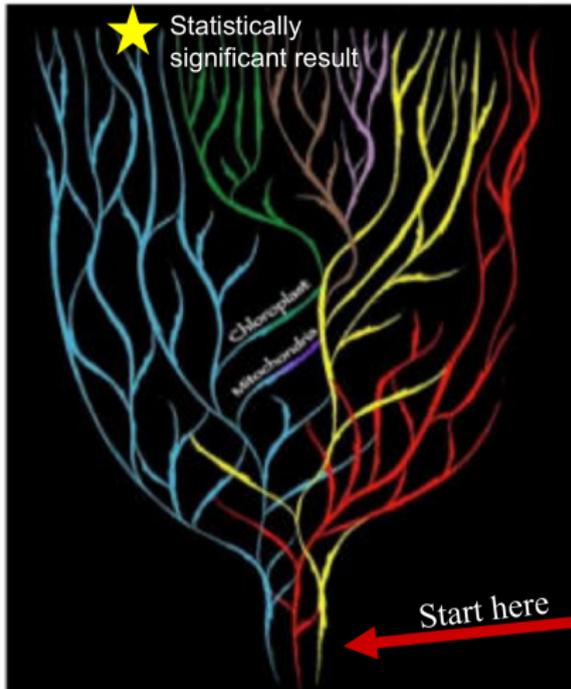
14 Nov 2013

*“I thought of a labyrinth of labyrinths, of one sinuous spreading labyrinth that would encompass the past and the future . . . I felt myself to be, for an unknown period of time, an abstract perceiver of the world.” — Borges (1941)*

-Researchers will p-hack, intentionally or not, by choosing specifications, datasets, hypotheses, and others modelling decisions (Gelman and Loken, 2013)

-P-hacking is not addressed by adding robustness checks

# #1) A graphical view of it...



## The Garden of Forking Paths

Control for time?

Exclude outliers?

Median or mean?

**Hypothesis: "Does X affect Y?"**

## #2 Do reviewers of HE papers favour positive results?

THE  
ECONOMIC  
JOURNAL



*The Economic Journal*, **130** (July), 1226–1247 DOI: 10.1093/ej/ueaa011 © 2020 Royal Economic Society. Published by Oxford University Press. All rights reserved. For permissions please contact [journals.permissions@oup.com](mailto:journals.permissions@oup.com).

Advance Access Publication Date: 28 January 2020

### PUBLICATION BIAS AND EDITORIAL STATEMENT ON NEGATIVE FINDINGS\*

*Cristina Blanco-Perez and Abel Brodeur*

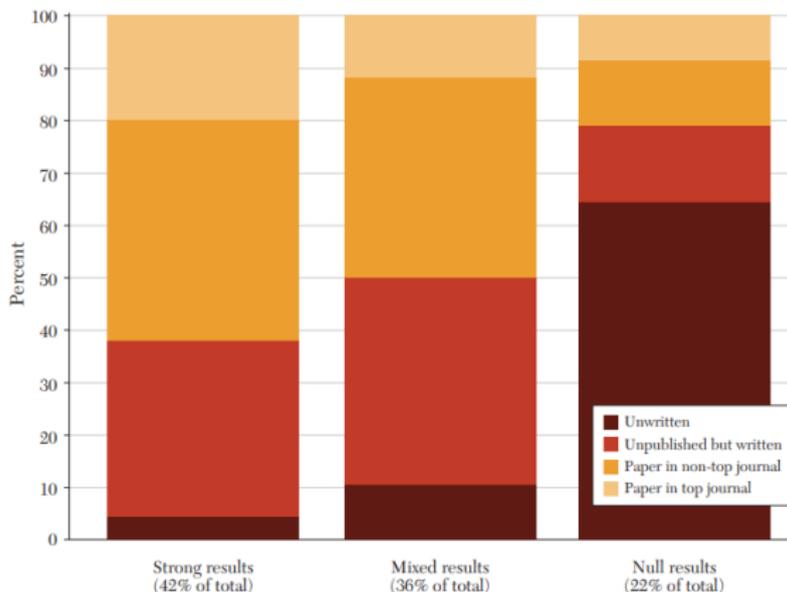
## #2

- In February 2015, the editors of eight health economics journals sent out an editorial statement aimed to reduce the extent of *specification searching*
  - Authors: submit papers with negative results as well
  - Referees: not to be biased against studies that do not reject null hypotheses
- Blanco-Perez and Brodeur (2020) tested whether the editorial statement decreased the extent of publication bias
- This analysis found that the publication biased was reduced by 18 points

## #3) File drawer problem

According to Rosenthal (1979)

- *Journals are filled with the 5% of the studies that show Type I errors, while the file drawers are filled with the 95% of the studies that show non significant results*
- Studies tucked away in file drawers, that did not make the magic  $<.05$  level
- Consequence: High percentage of false positives. We cannot produce accurate measures of true effects



*Figure 1.* Publication Rates and Rates of Writing Up of Results from Experiments with Strong, Mixed, and Null Results

*Source:* Mervis (2014b). Reprinted with permission from AAAS. Experiments represent nearly the complete universe of studies conducted by the TESS.

## Registration can help with publication bias

- To **track** the complete body of knowledge in a topic of research, regardless of the direction and magnitude of the results
- The **use of registries** to catalogue all research conducted on a given topic
- Registration before the analysis. Sources of information that serve as a **permanent and public record** of all the research done in a specific field, independent of the final results

## What is a PAP?

- "A document wherein a researcher outlines her planned empirical analysis **before** having an opportunity to access the data" Burlig (2018)
- "For the PAP to be credible, this **should be submitted** to a (public) registry, which archives and timestamps the PAP, preventing it from being altered after the researcher gains access to her data" Burlig (2018)

## PAPs in observational studies (Burlig, 2018)

The vast majority of papers (in economics) are non-RCTs.

So, *how do observational studies fit into the transparency landscape?*

- Many observational studies use public data and this could hinder pre-registration
- Challenge! **Not everything can be credibly pre-registered**

# When pre-registration is possible?

## Scenarios where pre-registration is possible

- The data are not yet available
- The event to be studied has not yet occurred
- The data are confidential

## PAP before data is released

This applies to public, administrative or your own data

- A large number of administrative datasets are announced pre-release
- Better still, there are often multiple waves
- Many events in the world are announced beforehand (i.e elections; policy changes)

## PAP using confidential data

- Transparency and replication is hard *with* data . . . now imagine without!
  - The fraction of papers published in AER that requested exemptions to its open data policy rose from 6.5% in 2005 to over 45% by 2016
- Using confidential data opens interesting new opportunities. For example:
  - You can easily argue that you have not seen the data. A data use agreement or transfer record serves as a time stamp
  - You are asked to submit a document detailing what you wish to do with the data in order to gain access ← PAP

## PAP in practice

- The PAP checklist by McKenzie (2012)
- PAP for RCTs from [Alejandro Ganimian](#)
- PAP for observational studies from Burlig (2018)

## FAQ about pre-registration(Science, 2021)

Can someone *scoop* my ideas?

- Date-stamped pre-registration make your claim verifiable
- By the time you have pre-registered, you are ahead of any possible scooper
- Embargo your pre-registration

## Where to register?

- The American Economics Association (RCTs only)
- The J-PAL Hypothesis Registry
- EGAP
- 3ie
- The Open Science Framework (OSF)
- Clinicaltrials.gov
- As-predicted

## Useful resources

- <https://www.cos.io/initiatives/prereg>
- <https://www.povertyactionlab.org/resource/pre-analysis-plans>
- [https://dimewiki.worldbank.org/Pre-Analysis\\_Plan](https://dimewiki.worldbank.org/Pre-Analysis_Plan)
- [https://www.bitss.org/wp-content/uploads/2015/12/KatherineCasey\\_PAPs.pdf](https://www.bitss.org/wp-content/uploads/2015/12/KatherineCasey_PAPs.pdf)
- [https://oconnell.fas.harvard.edu/files/lkatz/files/dbfkos\\_pap\\_w26993.pdf](https://oconnell.fas.harvard.edu/files/lkatz/files/dbfkos_pap_w26993.pdf)

# Thanks!

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Blanco-Perez, C. and Brodeur, A. (July 1, 2020). “Publication Bias and Editorial Statement on Negative Findings”. In: *The Economic Journal* 130.629, pp. 1226–1247.



Brodeur, A., Cook, N., and Heyes, A. (Nov. 2020). “Methods Matter: p-Hacking and Publication Bias in Causal Analysis in Economics”. In: *American Economic Review* 110.11, pp. 3634–3660.



Burlig, F. (July 2018). “Improving transparency in observational social science research: A pre-analysis plan approach”. en. In: *Economics Letters* 168, pp. 56–60.



Christensen, G. and Miguel, E. (Sept. 2018). “Transparency, Reproducibility, and the Credibility of Economics Research”. en. In: *Journal of Economic Literature* 56.3, pp. 920–980.



Garret, C. (June 2017). *BITSS Reproducibility Training*. original-date: 2017-04-11T20:06:18Z.



Gelman, A. and Loken, E. (2013). “The garden of forking paths: Why multiple comparisons can be a problem, even when there is no “fishing expedition” or “p-hacking” and the research hypothesis was posited ahead of time”. In: p. 17.



Gerber, A. S. and Malhotra, N. (Aug. 2008). “Publication Bias in Empirical Sociological Research: Do Arbitrary Significance Levels

Distort Published Results?” en. In: *Sociological Methods & Research* 37.1. Publisher: SAGE Publications Inc, pp. 3–30.



McKenzie, D. (2012). *A pre-analysis plan checklist*. URL: <https://blogs.worldbank.org/impactevaluations/a-pre-analysis-plan-checklist> (visited on 09/14/2021).



Rosenthal, R. (1979). “The file drawer problem and tolerance for null results”. In: *Psychological Bulletin* 86.3. Place: US Publisher: American Psychological Association, pp. 638–641.



Science, C. f. O. (2021). *Preregistration*. URL: <https://www.cos.io/initiatives/prereg> (visited on 09/15/2021).