Open Science Toolbox:

Leveraging Methodological Reforms to Accelerate Research

ICPS Paris March 2019

ALL SLIDES: **https://osf.io/tve2q/**

2019-03-08 (updated: 2019-03-09)

Many Labs 2

Investigating Variation in Replicability across Sample and Setting

Richard Klein

Univ. Grenoble Alpes

Replication Crisis

Replication Crisis

Theoretical concern

Replication Crisis

Theoretical concern

Open access, freely

Essay

Why Most Published Research Findings Are False

John P. A. Ioannidis

Journal of Personality and Social Psychology
2011, Vol. 100, No. 3, 407–425

© 2011 American Psychological Association
0022-3514/11/$12.00 DOI: 10.1037/a0021524

Feeling the Future: Experimental Evidence for Anomalous Retroactive Influences on Cognition and Affect

Daryl J. Bem
Cornell University

False-Positive Psychology: Undisclosed Flexibility in Data Collection and Analysis Allows Presenting Anything as Significant

Joseph P. Simmons[1], Leif D. Nelson[2], and Uri Simonsohn[1]
[1]The Wharton School, University of Pennsylvania, and [2]Haas School of Business, University of California, Berkeley

Replication Crisis

Evidence of a problem

- `Reproducibility Project: Psychology` (OSC, 2015)
  - ~40/100 replicated
- `Social Sciences Replication Project` (Camerer et al., 2018)
  - 13/21 replicated
- `Multiple large-scale Registered Reports`

Replication Crisis

Addressing the problem

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  - False positives
  - Incompetent replicators
  - Unknown moderators (imprecise theory?)
  - Contextual differences
  - Etc.

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- Solution depends on the cause
- What should we expect of replications? What does replication "look like"? (statistically, practically)

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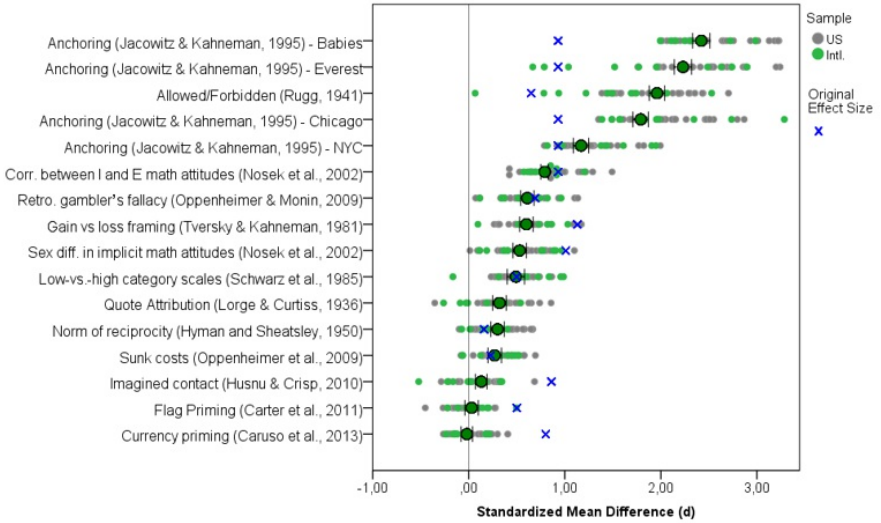
- 5 "Many Labs" projects completed or in-progress.
- I'm presenting Many Labs 2 (December)
- Same thing as Many Labs 1 (2014), but much bigger.

Many Labs Projects



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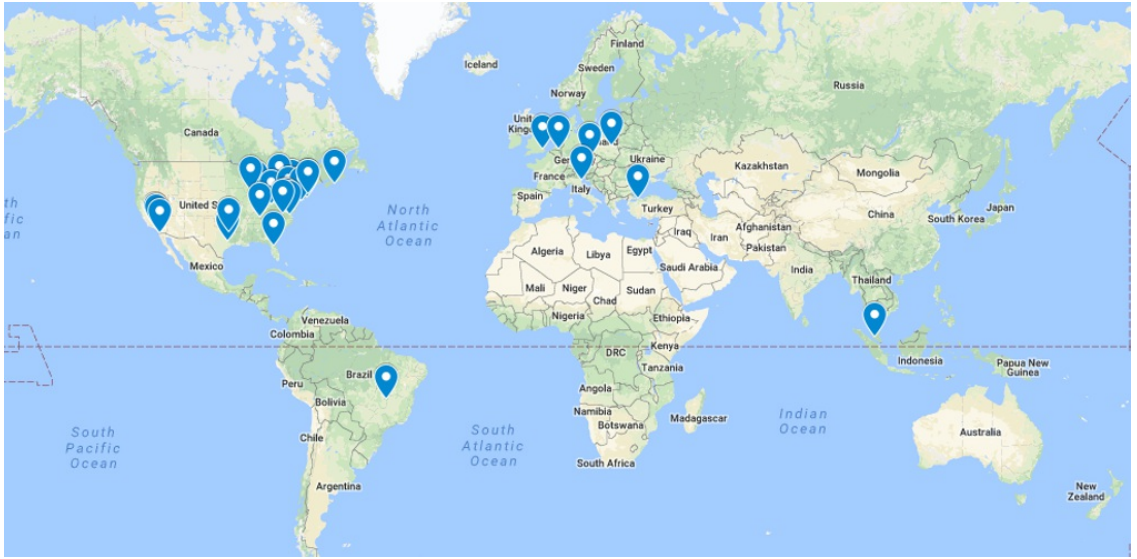
  - Each reviewed by original authors or other experts (Registered Report)

Many Labs 1 Map (2014)



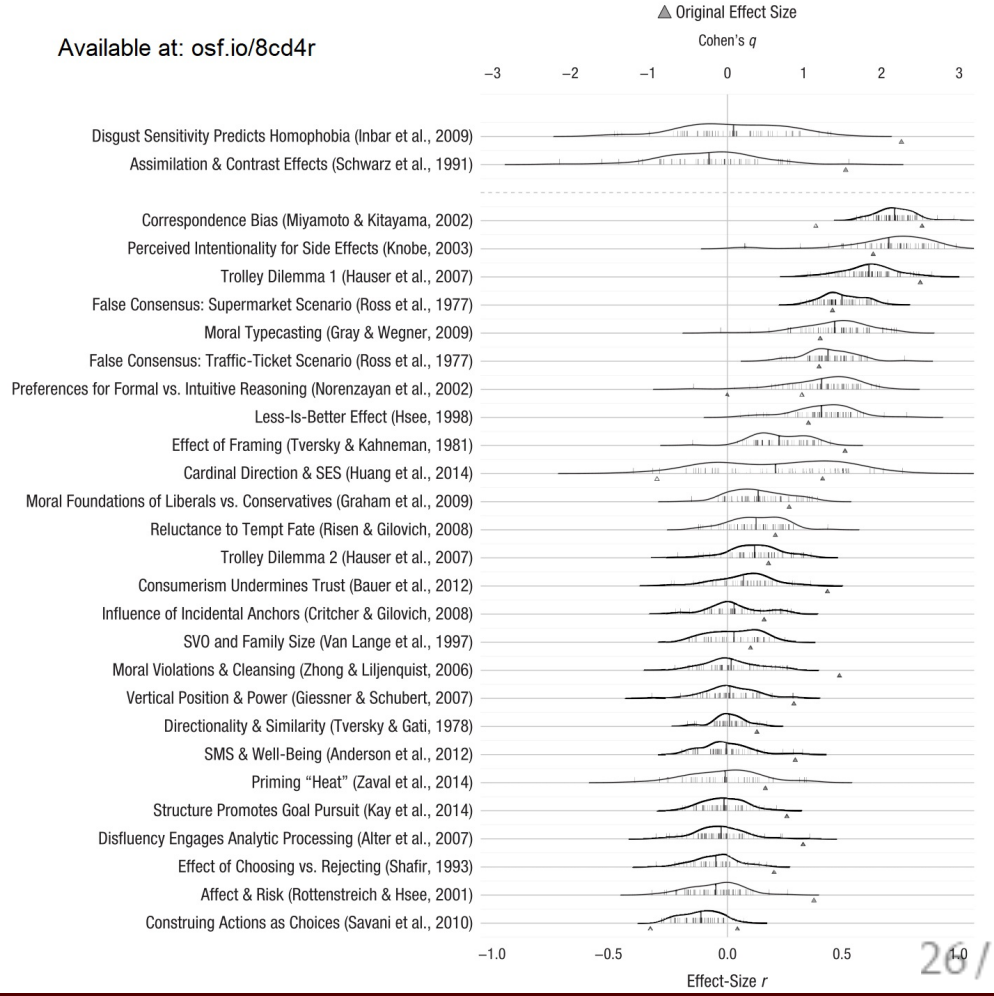
Many Labs 2 Map (2018)

Many Labs 2

- 125 samples
- 36 countries
- 16 languages
- 15,305 participants

Results

Available at: osf.io/8cd4r



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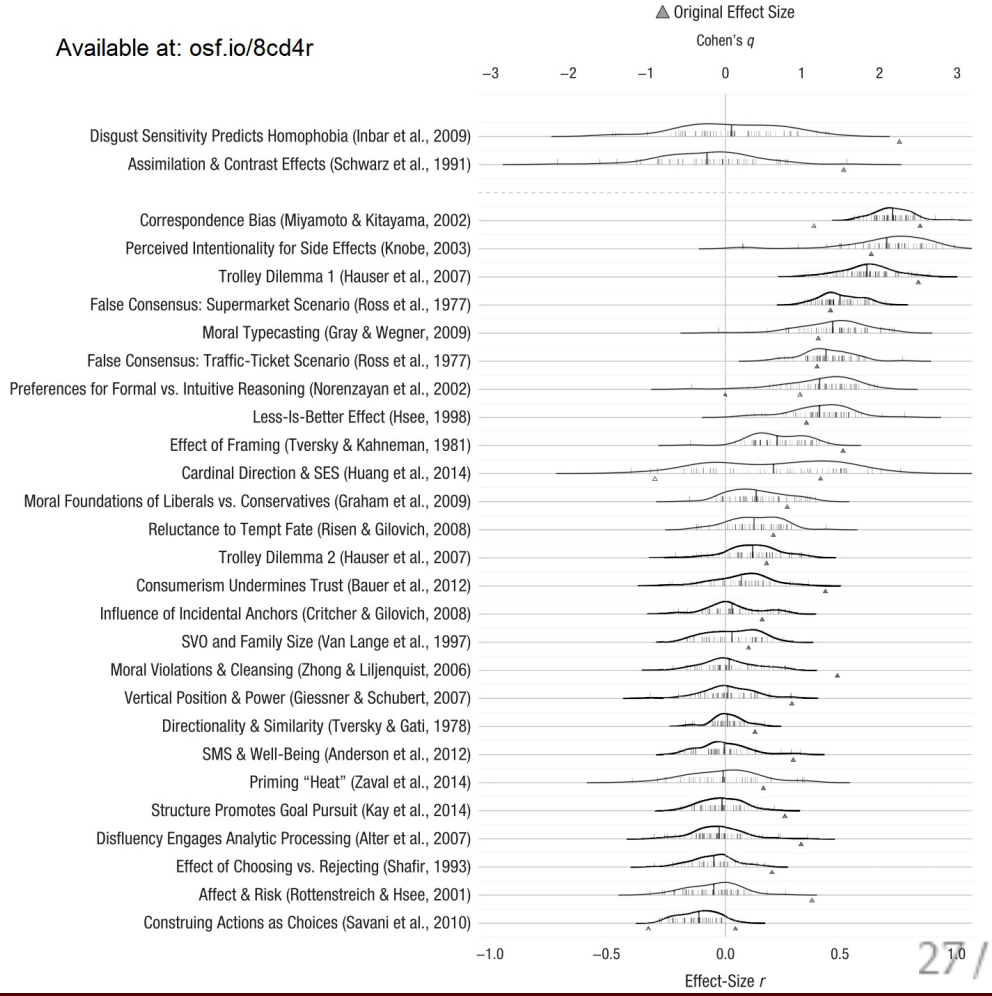

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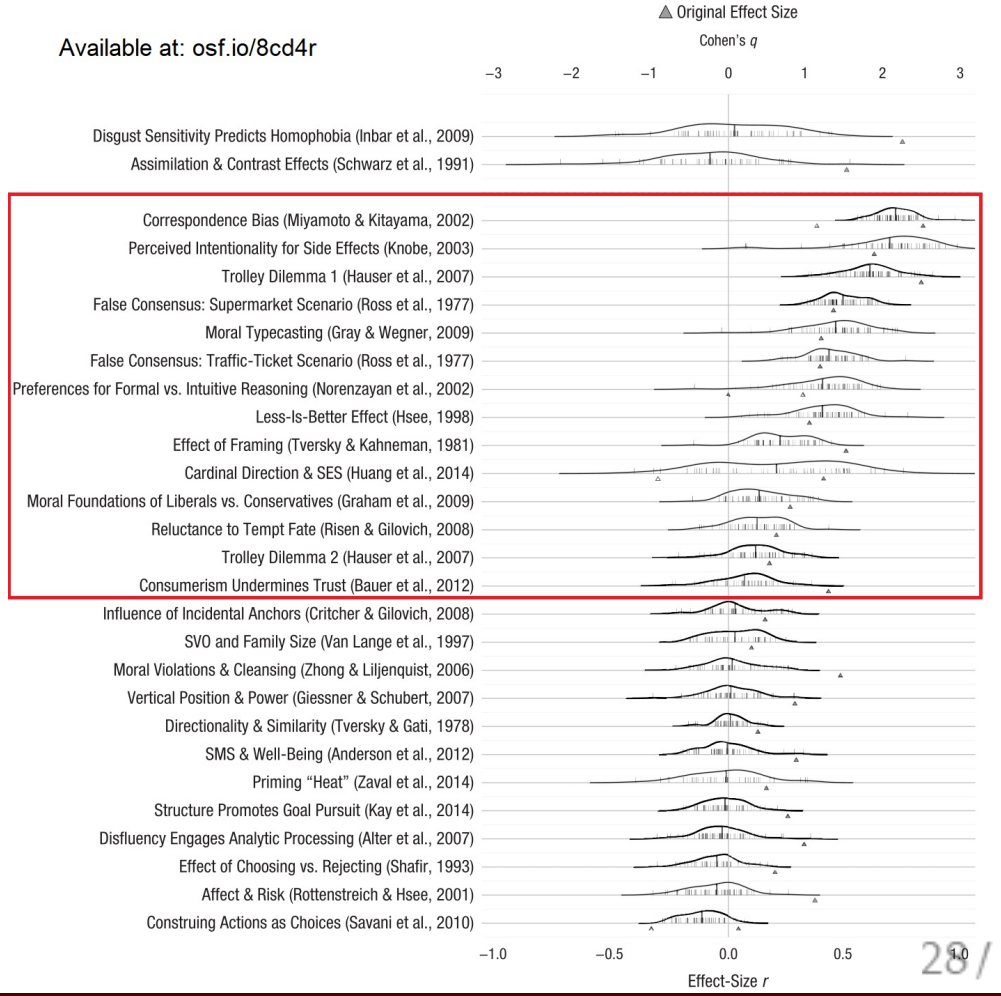

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- Med. original $d = 0.60$
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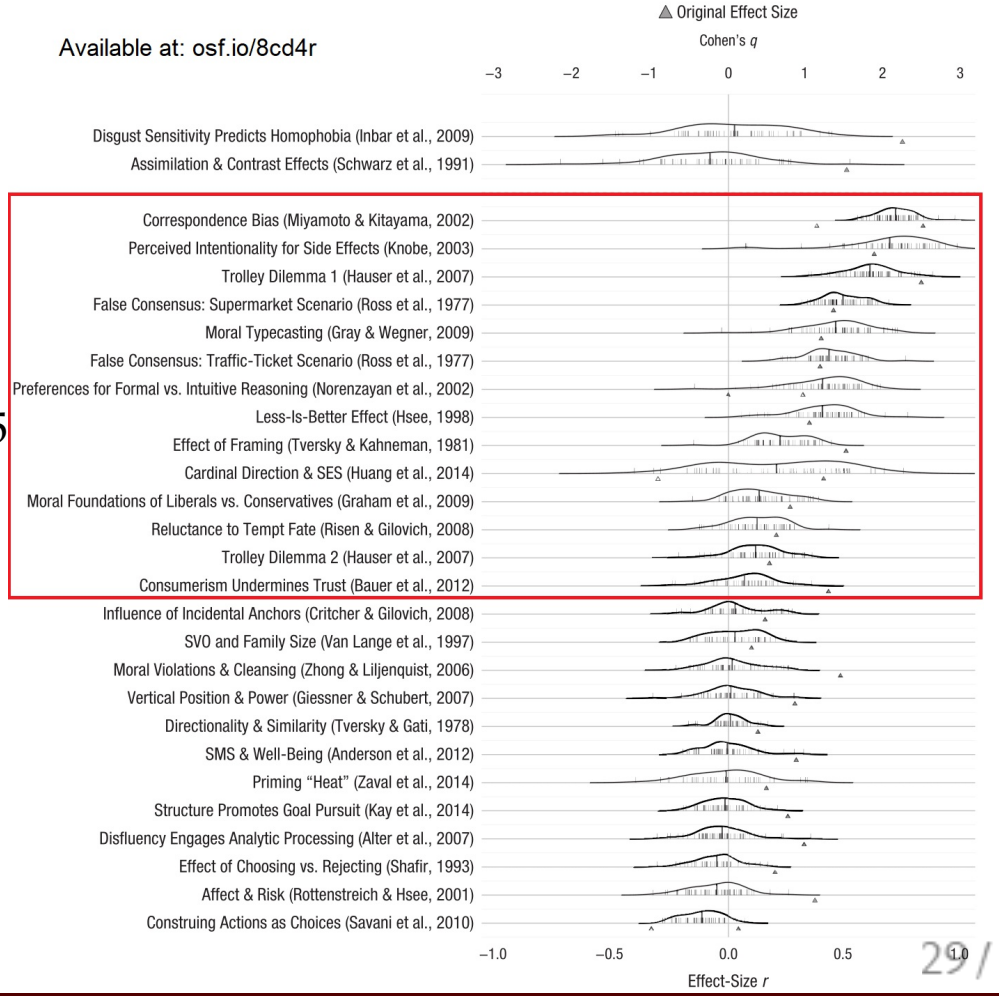

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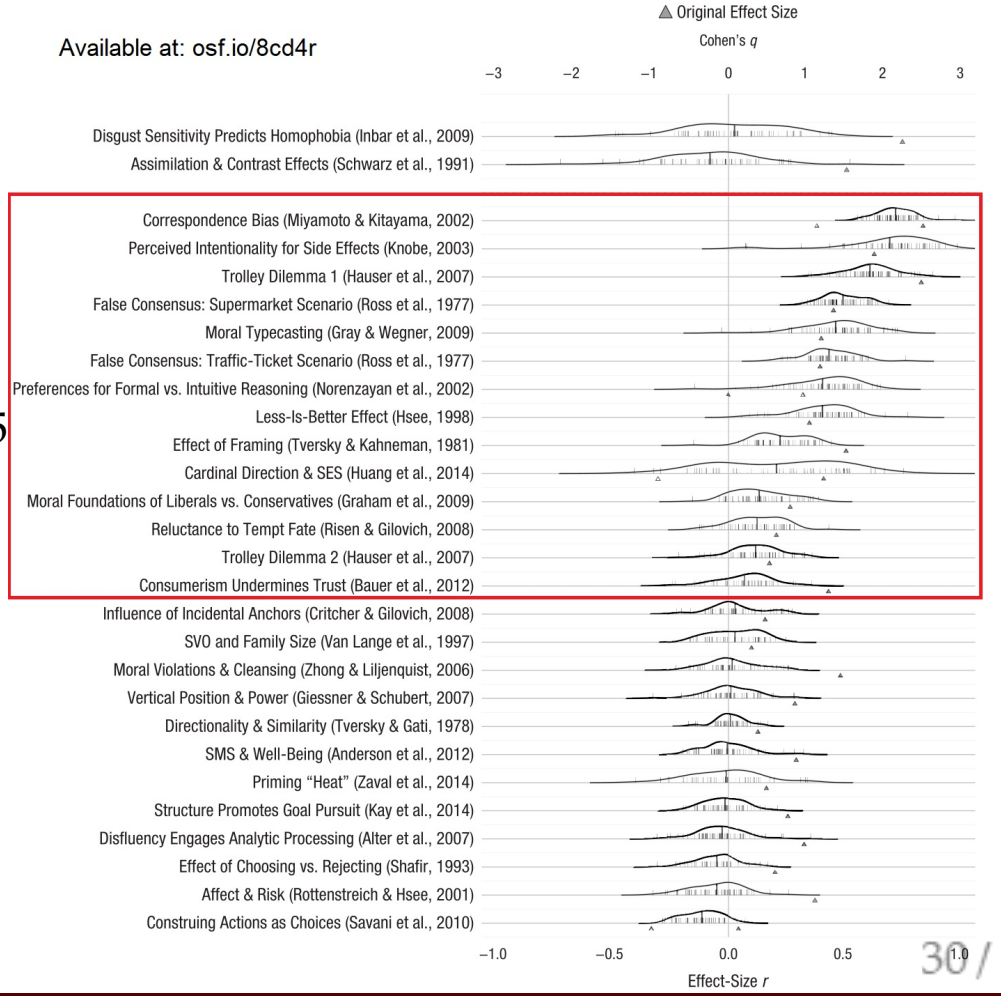

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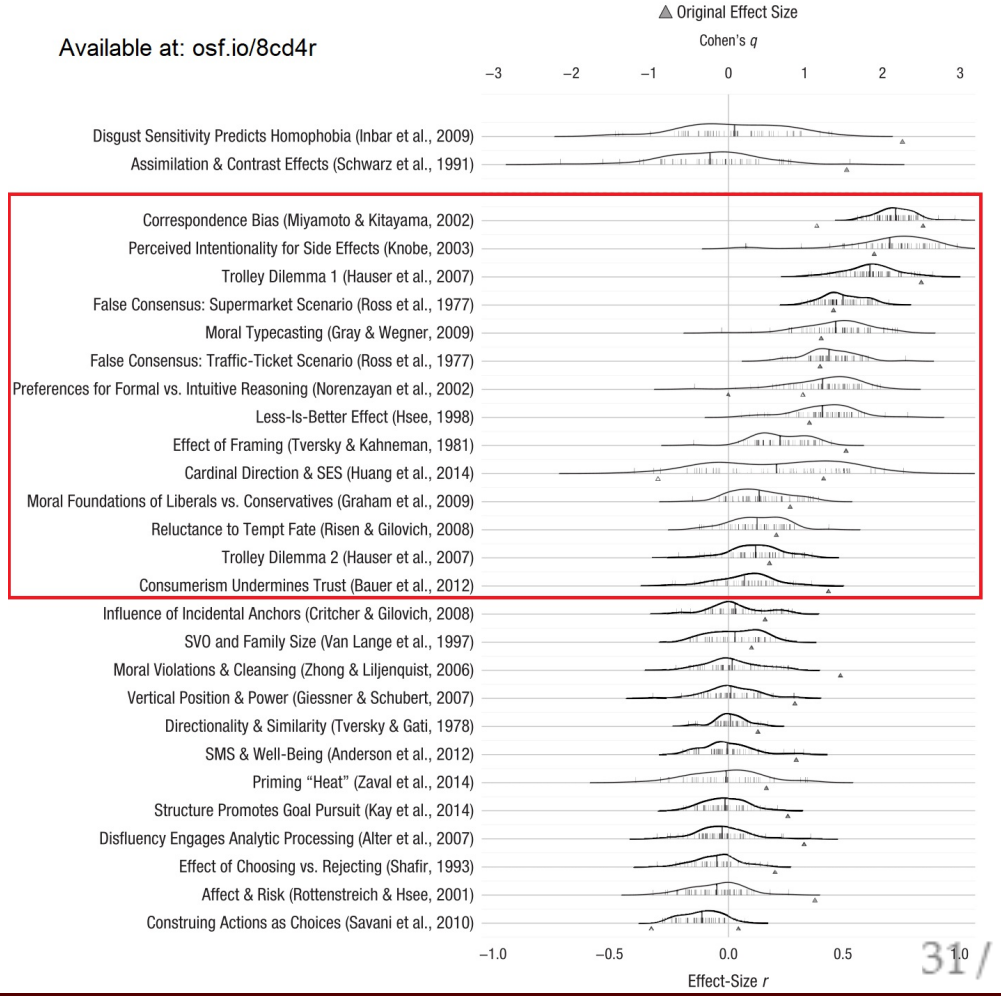

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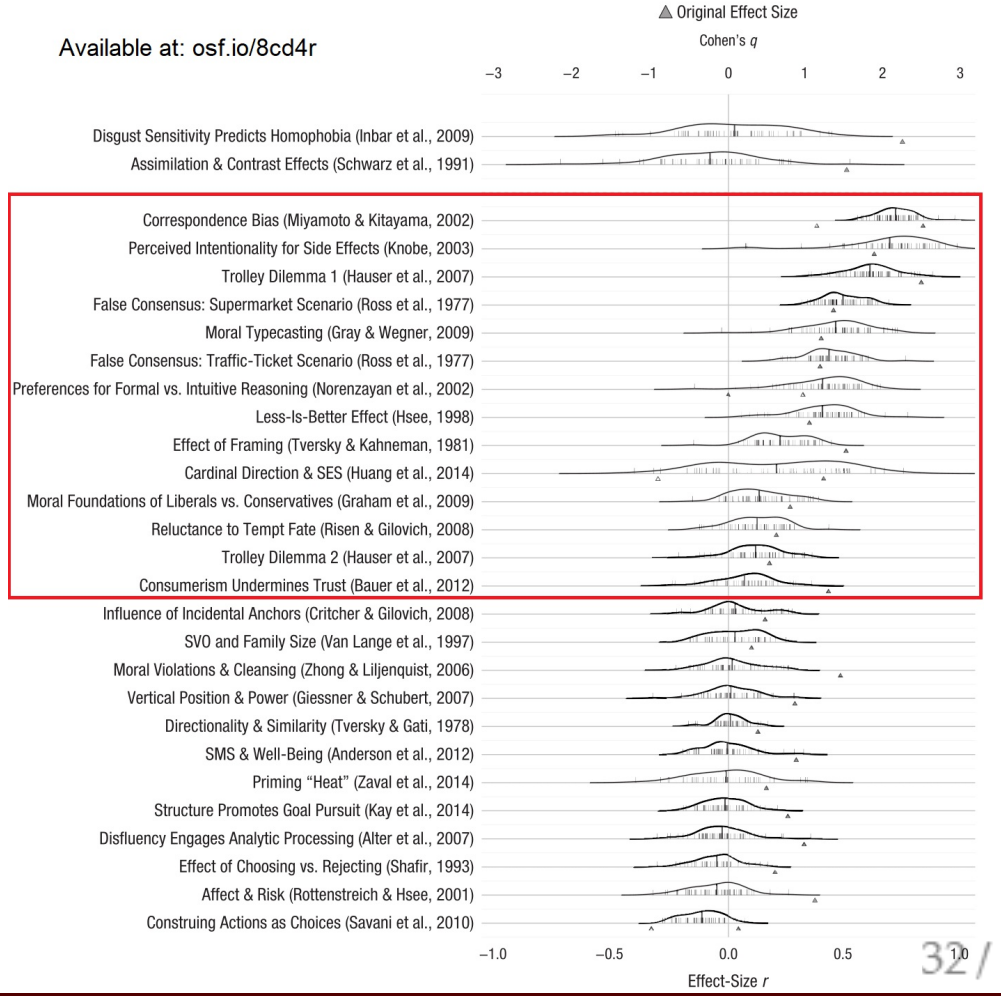

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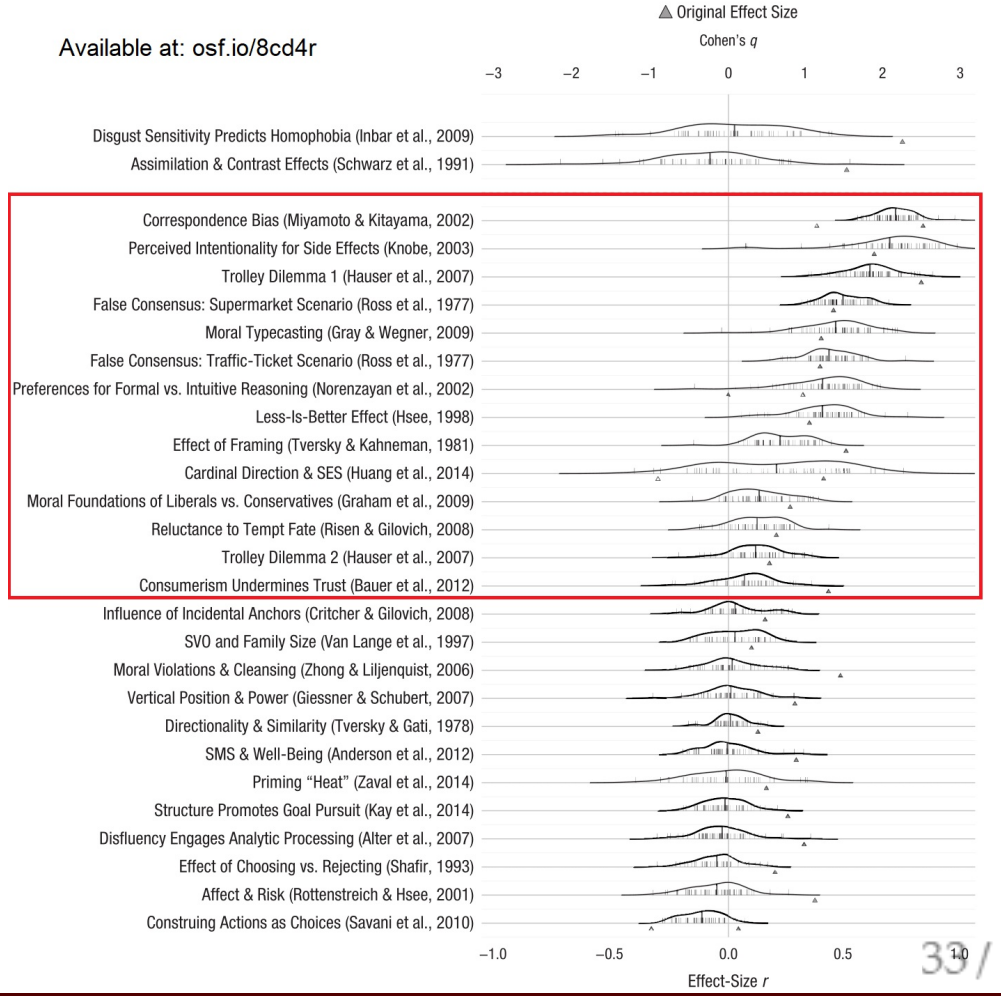

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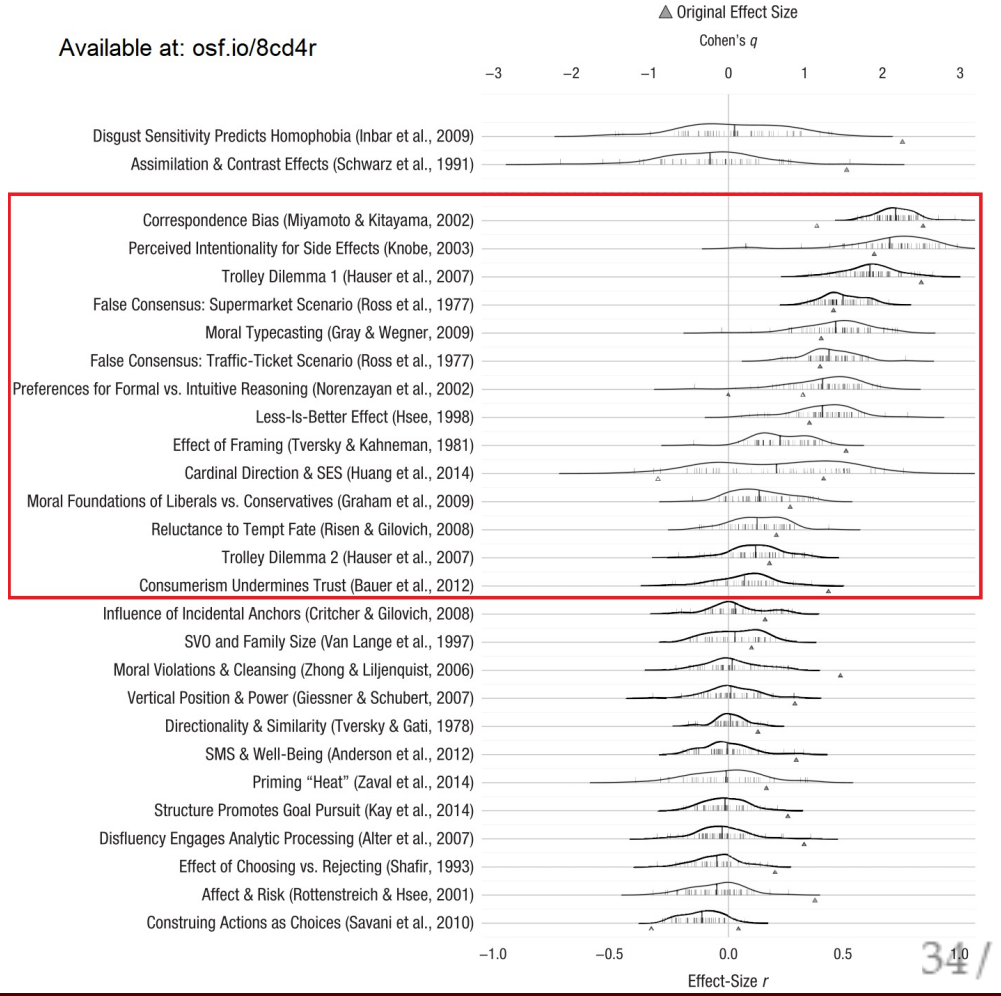

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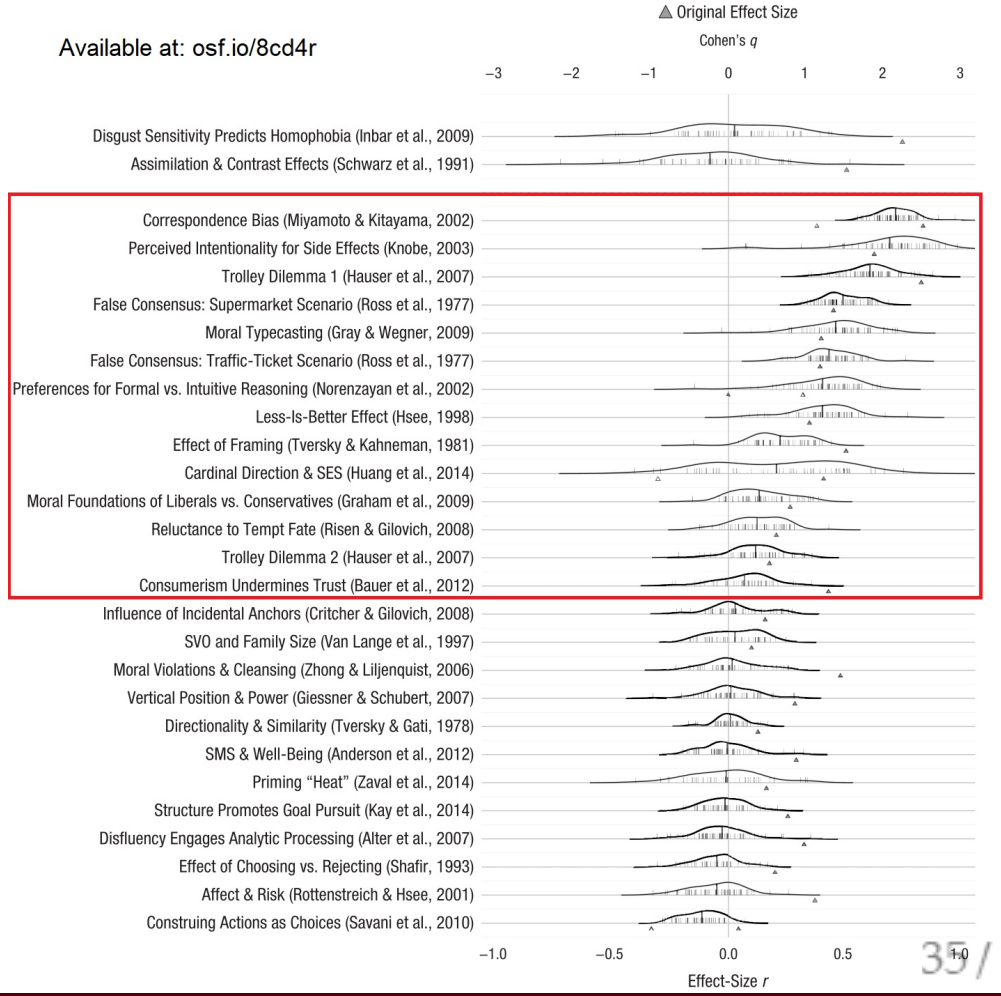
  - N = ~80 per site



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- Open data: **https://osf.io/8cd4r/**
  - CC0, free use

Thanks!

Special thanks to co-leads Fred Hasselman, Michelangelo Vianello, and Brian Nosek + 186 other co-authors.

Great time to get involved (cos.io/about/news/)

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