“Opening Up” (Cognitive Neuro)science

Rik Henson

MRC CBU, Cambridge

With thanks to: Rogier Kievit, Niko Kriegeskorte, Dorothy Bishop, Anthony Isles, Amy Orben, Marcus Munafo…

The Problem

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STANFORD GRADUATE SCHOOL OF BUSINESS

Education

Discredited "Mozart Effect" Remains Music to American Ears

Science | Wed Mar 28, 2012 7:09pm BST

In cancer science, many "discoveries" don't hold up

NEW YORK | BY SHARON BEGLEY

53 landmark papers on cancer

47 did not replicate

For a comedian's recent perspective:

https://www.facebook.com/LastWeekTonight/videos/896755337120143

In Neuro…

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Power failure: why small sample size undermines the reliability of neuroscience

Katherine S. Button[1,2], John P. A. Ioannidis[3], Claire Mokrysz[1], Brian A. Nosek[4], Jonathan Flint[5], Emma S. J. Robinson[6] and Marcus R. Munafò[1]

Scanning the horizon: towards transparent and reproducible neuroimaging research

Russell A. Poldrack[1], Chris I. Baker[2], Joke Durnez[1,3], Krzysztof J. Gorgolewski[1], Paul M. Matthews[4], Marcus R. Munafò[5,6], Thomas E. Nichols[7], Jean-Baptiste Poline[8], Edward Vul[9] and Tal Yarkoni[10]

Article

Reproducible brain-wide association studies require thousands of individuals

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Check for updates

Scott Marek[1,30], Brenden Tervo-Clemmens[2,3,30], Finnegan J. Calabro[4,5], David F. Montez[6], Benjamin P. Kay[6], Alexander S. Hatoum[1], Meghan Rose Donohue[1], William Foran[4], Ryland L. Miller[1,6], Timothy J. Hendrickson[7], Stephen M. Malone[8], Sridhar Kandala[1], Eric Feczko[9,10], Oscar Miranda-Dominguez[9,10], Alice M. Graham[11], Eric A. Earl[9,11], Anders J. Perrone[9,11], Michaela Cordova[11], Olivia Doyle[11], Lucille A. Moore[11], Gregory M. Conan[9,11], Johnny Uriarte[11], Kathy Snider[11], Benjamin J. Lynch[9,12], James C. Wilgenbusch[9,12], Thomas Pengo[7], Angela Tam[13,14,15,16], Jianzhong Chen[13,14,15,16], Dillan J. Newbold[6], Annie Zheng[6], Nicole A. Seider[6], Andrew N. Van[6,17], Athanasia Metoki[6], Roselyne J. Chauvin[6], Timothy O. Laumann[1], Deanna J. Greene[18], Steven E. Petersen[6,17,19,20,21], Hugh Garavan[22], Wesley K. Thompson[23], Thomas E. Nichols[24], B. T. Thomas Yeo[13,14,15,16,25,26], Deanna M. Barch[1,21], Beatriz Luna[3,4], Damien A. Fair[9,10,27,31] & Nico U. F. Dosenbach[6,17,19,28,29,31]

In Neuroimaging…

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*"…the **high dimensionality of fMRI data**, the **relatively low power of most fMRI studies** and the **great amount of flexibility in data analysis** contribute to a potentially high degree of false-positive findings."*

The Problems

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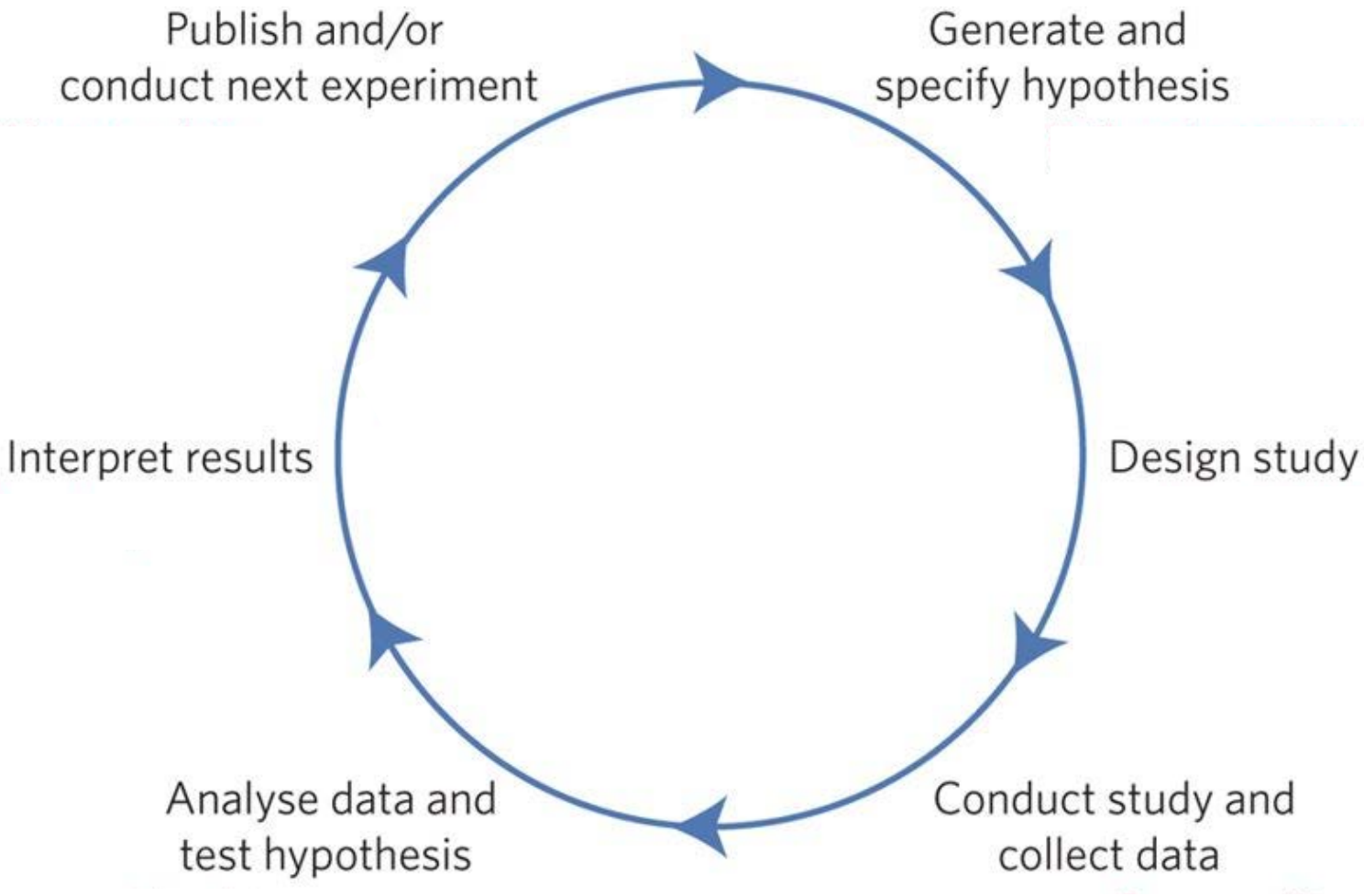

Munafo et al. (2017), Nature Human Behaviour

Overview

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- Registration
  - Study Registration (eg OSF)
  - Registered Reports
  - Pre-Registration Posters
- Statistical analysis
- Sharing Data and Code
- Publication
- Research Culture

(Un)conscious Bias

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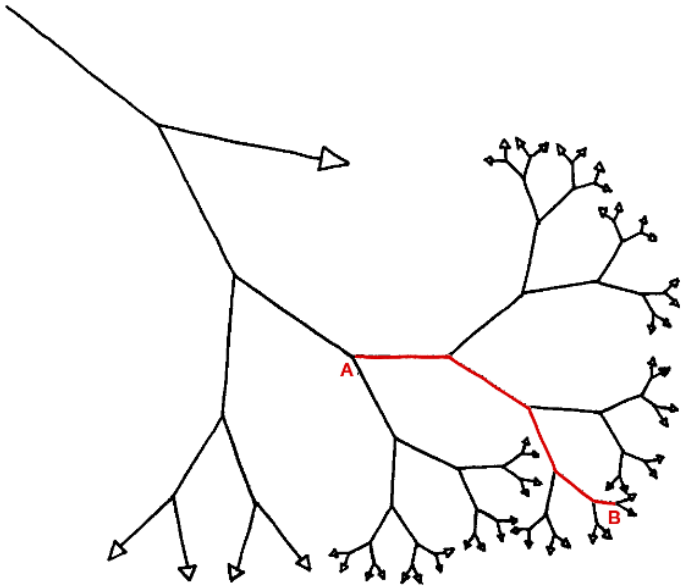
The Garden of Forking Paths
by Jorge Luis Borges



Particularly likely in neuroimaging, given so many analysis choices…?

Multiverse analyses?

HARKing

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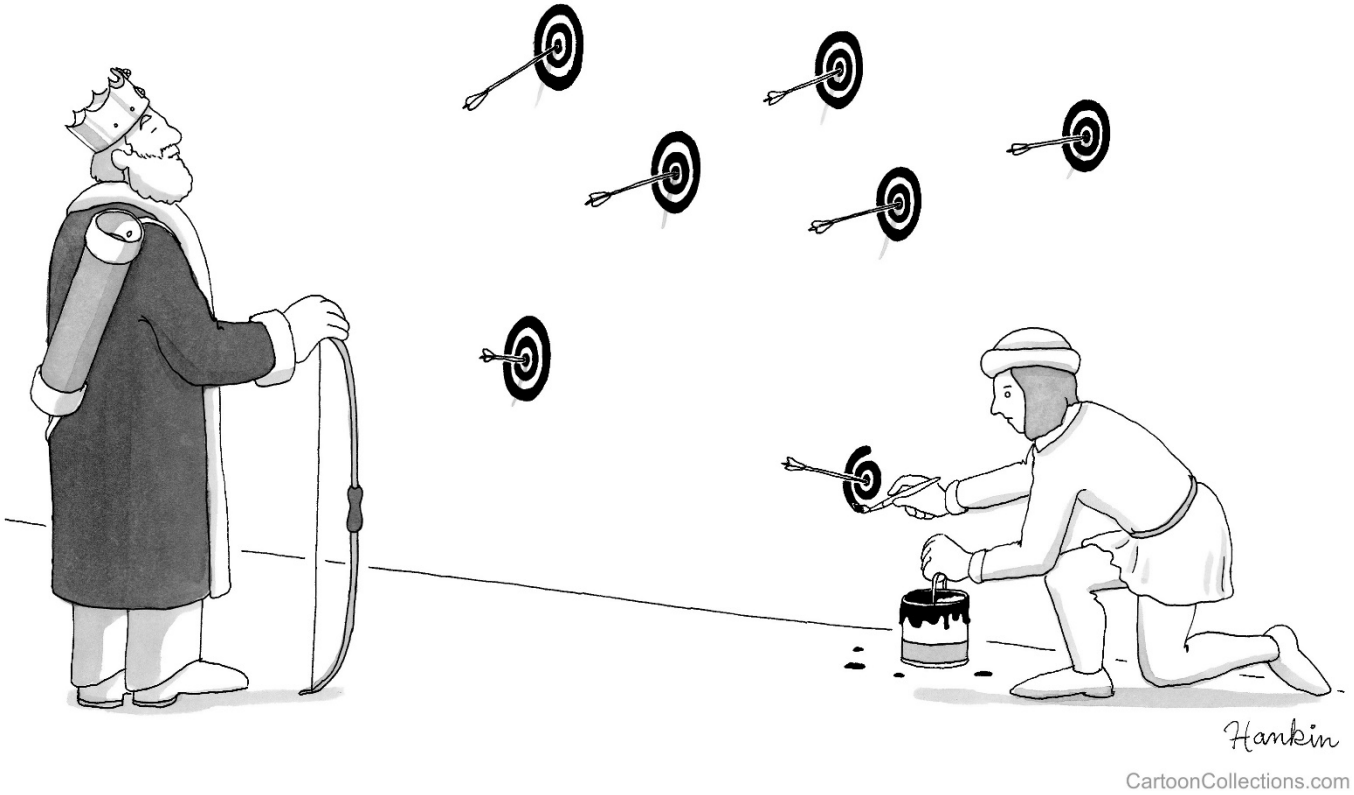
HARK = "Hypothesising After the Results are Known"



OSF Registration

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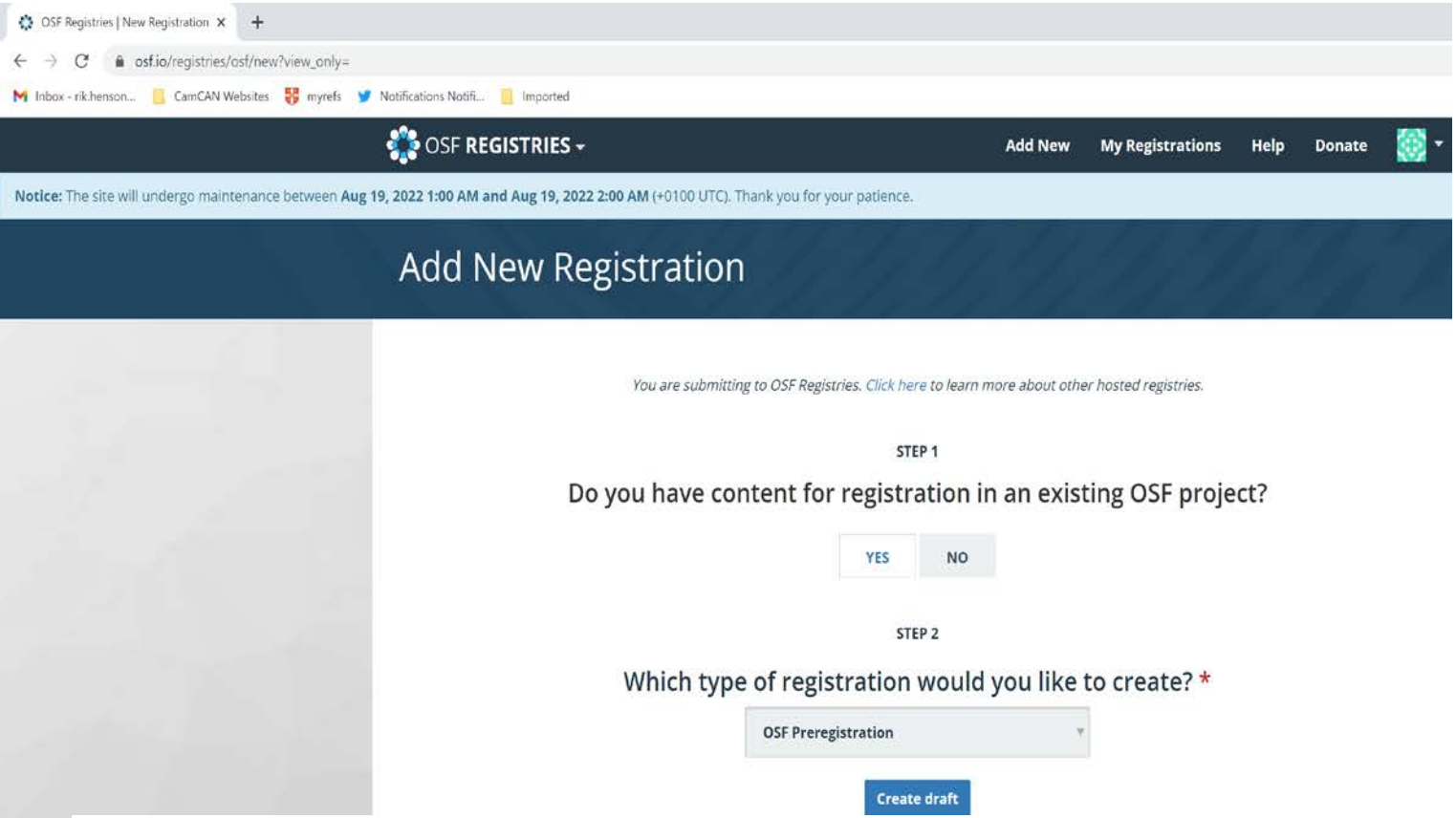

CENTER FOR OPEN SCIENCE

- Various levels of specificity (ideally all analysis scripts!)
- Pre-registration time-stamps a public commitment, but i) not binding for publication, and ii) not reviewed before data collection

Registered Reports

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- Peer Review before data collection/analysis
- Guaranteed Publication regardless of results

Filing Drawer problem

Registered Reports

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- Peer Review before data collection/analysis
- Guaranteed Publication regardless of results

- Can report non-registered findings, but clear division between "confirmatory" and "exploratory" results

- Some of many Cognitive Neuroscience journals allowing RRs:
  Cortex, Frontiers, Journal of Cognitive Neuroscience, Nature Human Behaviour, Psychological Science, Quarterly Journal of Experimental Psychology, Brain Neuroscience Advances…

- (not currently: *Nature, Science, J. Neuroscience, Neuroimage, APA journals…* ☹)

Pre-Reg Posters

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Trends in Cognitive Sciences

Scientific Life

Title TBA: Revising the Abstract Submission Process

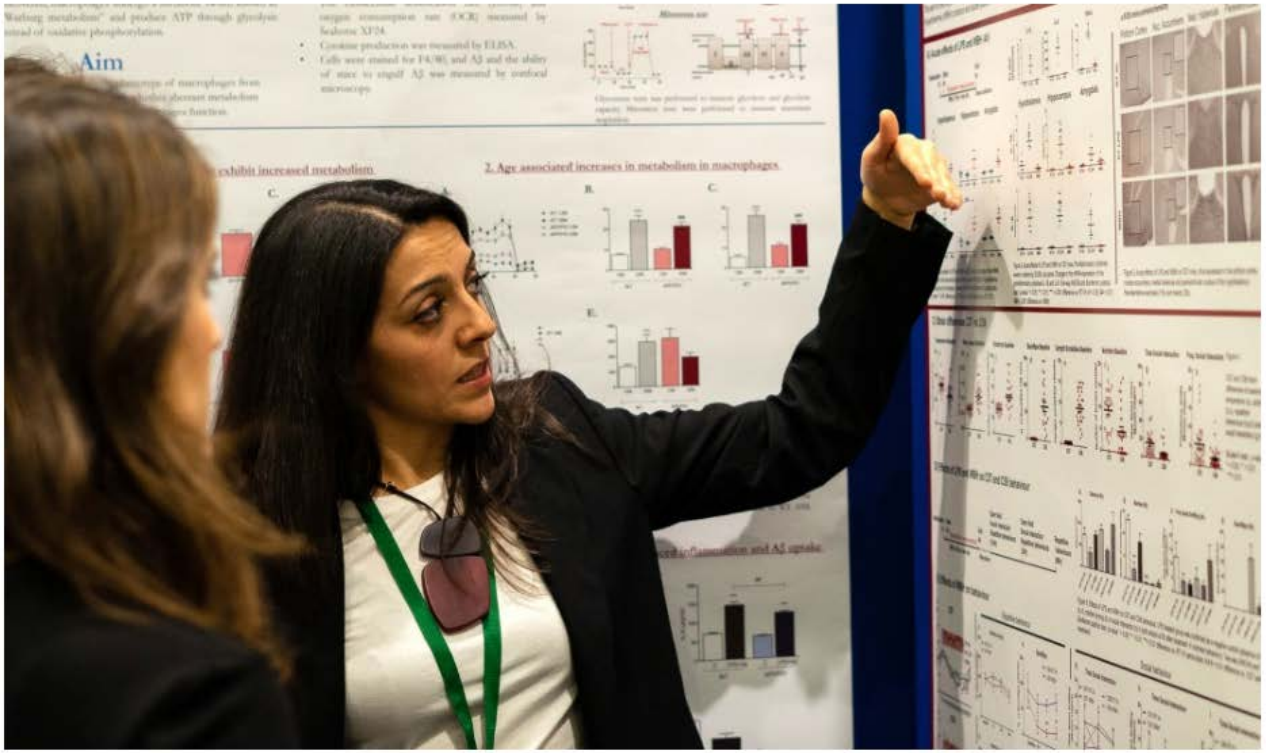
Roni Tibon,[1,*] CBU Open Science Committee,[1] and Richard Henson[1]

Academic conferences are among the most prolific scientific activities, yet the current abstract submission and review process has serious limitations. We propose a revised process that would address these limitations, achieve some of the aims of Open Science, and stimulate discussion throughout the entire lifecycle of the scientific work.

Home / News / Preregistration posters: early findings about presenting research early

PREREGISTRATION POSTERS: EARLY FINDINGS ABOUT PRESENTING RESEARCH EARLY

21st Aug 2019



- Chance to get feedback (eg, “Is hypothesis interesting? Sufficient controls? Appropriate analysis?”) before submitting a website registration or RR…

Overview

MRC Cognition and Brain Sciences Unit

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- Registration
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  - Registered Reports
  - Pre-Registration Posters
- Statistical analysis
  - Power and PPV
  - Bayesian Statistics
  - Sequential Designs
- Sharing Data and Code
- Publication
- Research Culture

Power

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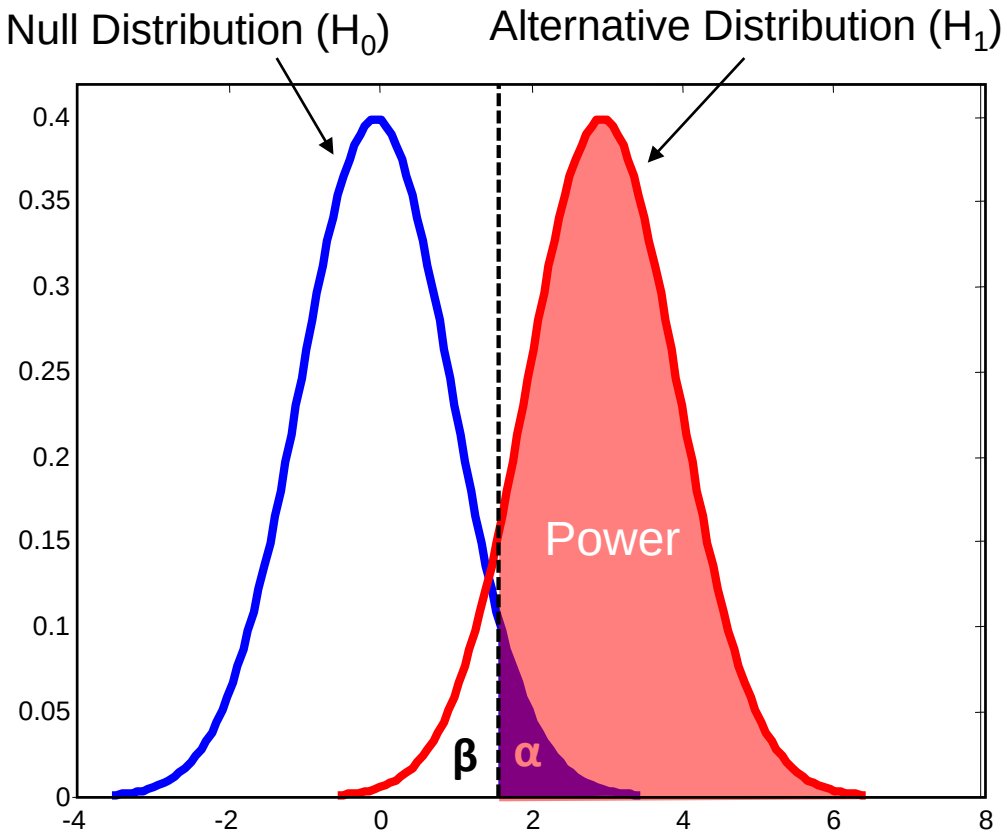
- Power = probability of rejecting H_0 when H_1 is true
- Must specify:
  - Sample size *n*
  - Level α (allowed false positive rate)
  - Standard deviation σ (population variability)
  - Effect magnitude Δ
- Last two can be replaced with
  - Effect size: $\delta = \Delta/\sigma$
  - E.g, according to Cohen:
    - δ=0.8 is a large effect size
    - δ=0.5 is a medium effect size
    - δ=0.2 is a small effect size



(Thanks to Tom Nichols for slides)

Power Curves

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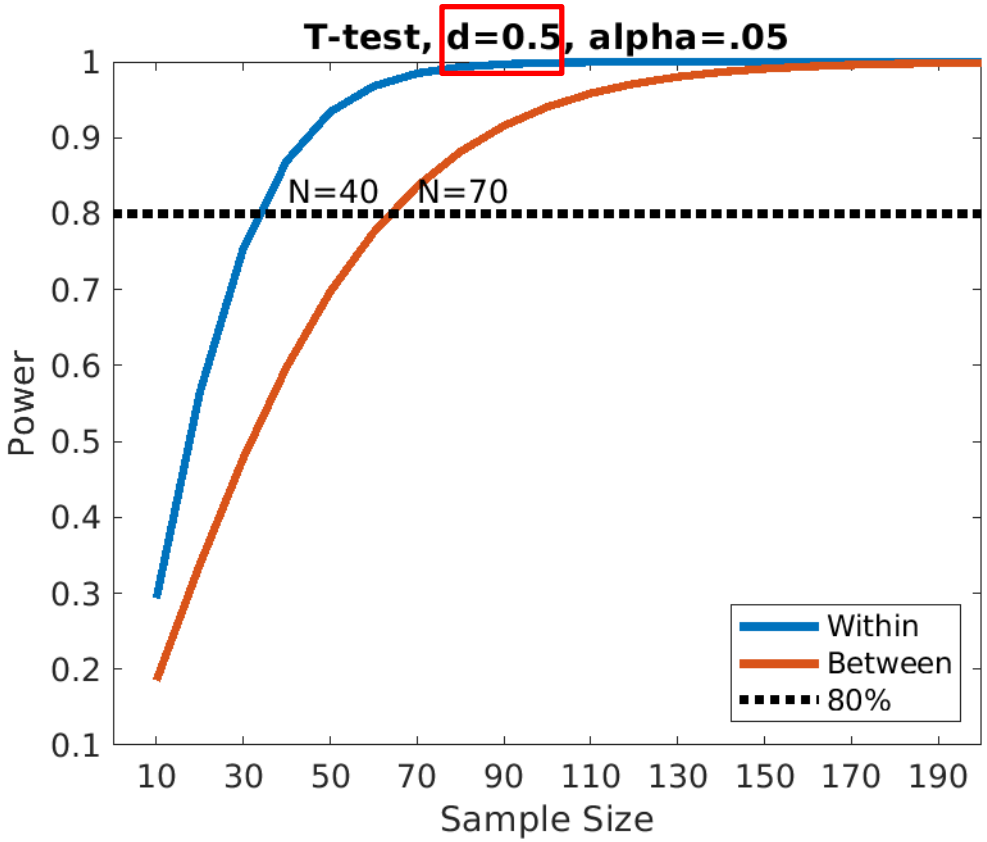
- Assuming medium effect size (d=0.5) for a frequentist T-test:
- Within-participant (repeated measures) tests more powerful than between-participant tests (latter need N~140 participants total for >80% power)
- G*Power: https://www.psychologie.hhu.de/arbeitsgruppen/allgemeine-psychologie-und-arbeitspsychologie/gpower



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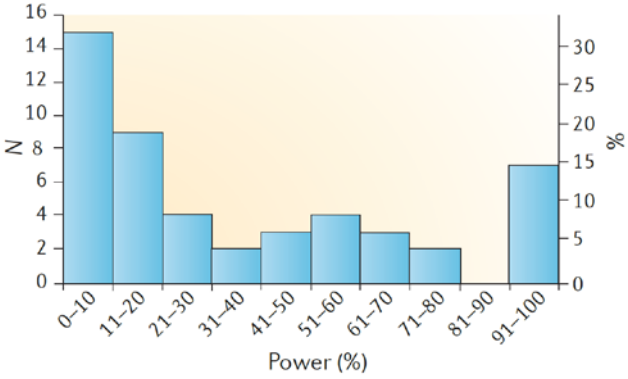

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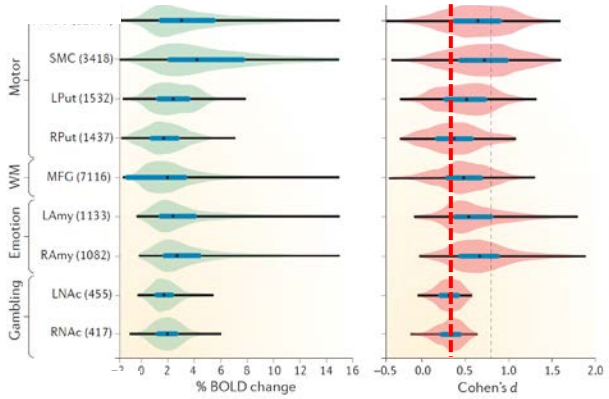

Article

Reproducible brain-wide association studies require thousands of individuals

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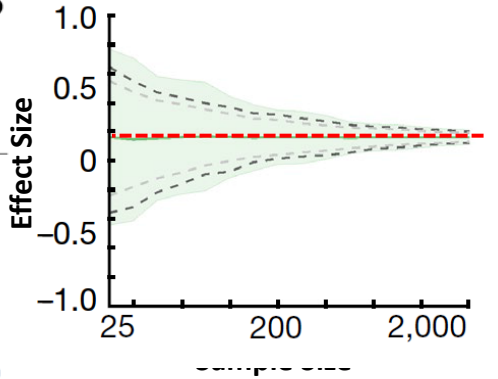

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Power Curves

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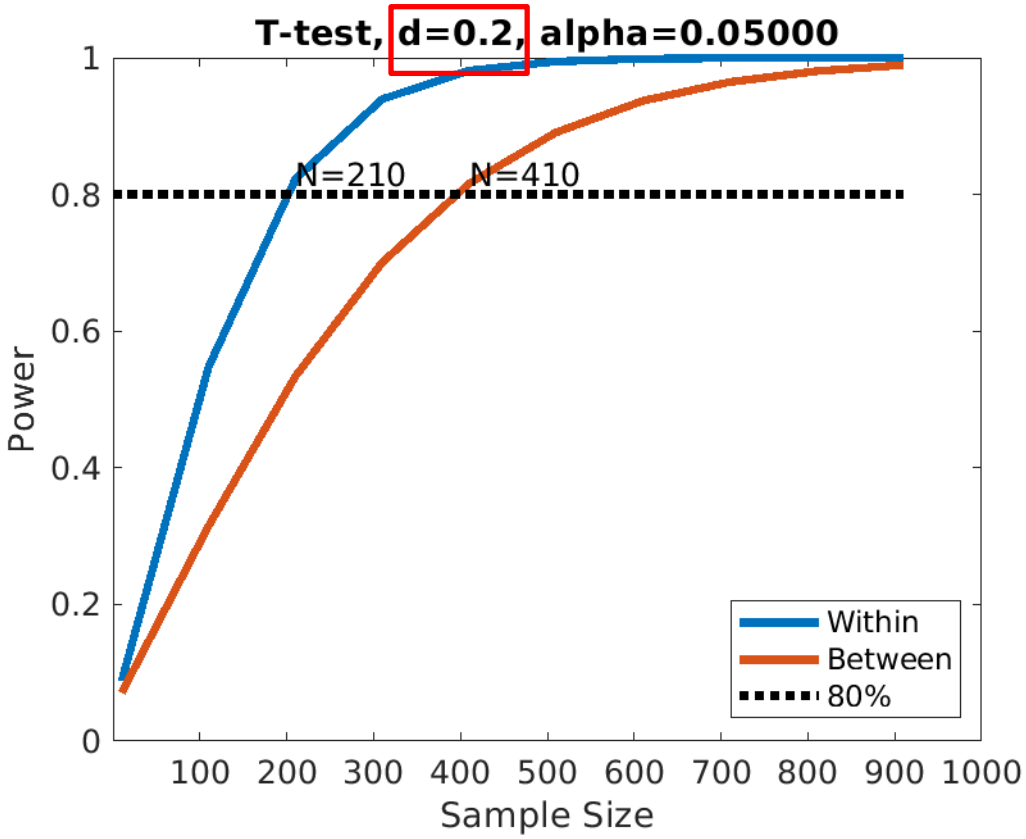
- Assuming medium effect size (d=0.5) for a frequentist T-test:
- Within-participant (repeated measures) tests more powerful than between-participant tests (latter need N~140 participants total for >80% power)
- With small effect size d=0.2, approaching total of N~1000 for between-participant test
- G*Power: https://www.psychologie.hhu.de/arbeitsgruppen/allgemeine-psychologie-und-arbeitspsychologie/gpower



Multiple Comparisons

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Power Curves

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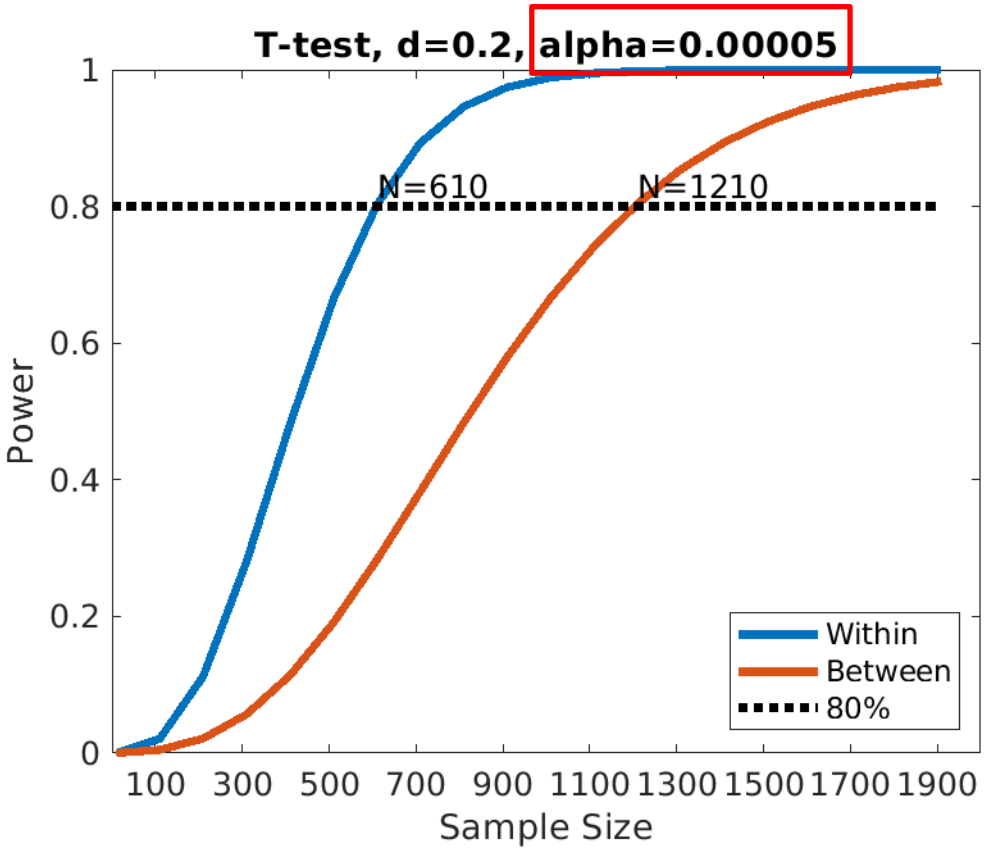
- Assuming medium effect size (d=0.5) for a frequentist T-test:
- Within-participant (repeated measures) tests more powerful than between-participant tests (latter need ~140 participants total for >80% power)
- With small effect size d=0.2, correction for 1000 tests ("resels") approaches total of N~2500 for between-participant test



More sophisticated treatment of multiple comparisons, within- and between-participant variance (e.g, #trials and #participants):

fMRIpower: http://fmripower.org
PowerMap: http://sourceforge.net/projects/powermap
NeuroPower: http://neuropower.shinyapps.io/neuropower

Positive Predictive Value (PPV)

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Open access, freely available online

Essay

Why Most Published Research Findings Are False

John P. A. Ioannidis

Summary

There is increasing concern that most current published research findings are false. The probability that a research claim is true may depend on study power and bias, the number of other studies on the same question, and, importantly, the ratio of true to no relationships among the relationships probed in each scientific field. In this framework, a research finding is less likely to be true when the studies conducted in a field are smaller; when effect sizes are smaller; when there is a greater number and lesser preselection of tested relationships; where there is greater flexibility in designs, definitions, outcomes, and analytical modes; when there is greater financial and other interest and prejudice; and when more teams are involved in a scientific field in chase of statistical significance. Simulations show that for most study designs and settings, it is more likely for a research claim to be false than true. Moreover, for many current scientific fields, claimed research findings may often be simply accurate measures of the

factors that influence this problem and some corollaries thereof.

Modeling the Framework for False Positive Findings

Several methodologists have pointed out [9–11] that the high rate of nonreplication (lack of confirmation) of research discoveries is a consequence of the convenient, yet ill-founded strategy of claiming conclusive research findings solely on the basis of a single study assessed by formal statistical significance, typically for a *p*-value less than 0.05. Research is not most appropriately represented and summarized by *p*-values, but, unfortunately, there is a widespread notion that medical research articles

It can be proven that most claimed research findings are false.

should be interpreted based only on *p*-values. Research findings are defined here as any relationship reaching

is characteristic of the field and can vary a lot depending on whether the field targets highly likely relationships or searches for only one or a few true relationships among thousands and millions of hypotheses that may be postulated. Let us also consider, for computational simplicity, circumscribed fields where either there is only one true relationship (among many that can be hypothesized) or the power is similar to find any of the several existing true relationships. The pre-study probability of a relationship being true is $R/(R+1)$. The probability of a study finding a true relationship reflects the power $1 - \beta$ (one minus the Type II error rate). The probability of claiming a relationship when none truly exists reflects the Type I error rate, α. Assuming that c relationships are being probed in the field, the expected values of the 2×2 table are given in Table 1. After a research finding has been claimed based on achieving formal statistical significance, the post-study probability that it is true is the positive predictive value, PPV.

PPV Arithmetic

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	Hypothesis True (H+)	Hypothesis False (H-)
Positive Finding D+	P(D+|H+) ("hit", "sensitivity") *Power* 1-β	P(D+|H-) ("false alarm", "Type I error") *FPR* α
Negative Finding D-	P(D-|H-) ("miss", "Type II error")	P(D-|H-) ("correct rejection", "specificity")

PPV Arithmetic

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	Hypothesis True (H+)	Hypothesis False (H-)
Positive Finding D+	P(D+|H+) ("hit", "sensitivity") *Power* 1-β	P(D+|H-) ("false alarm", "Type I error") *FPR* α
Negative Finding D-	P(D-|H-) ("miss", "Type II error")	P(D-|H-) ("correct rejection", "specificity")
(Prior)	P(H+)	P(H-)

PPV = P(H+|D+)

= p(D+|H+) x p(H+) / p(D+) *Bayes Rule*

p(D+) = p(D+/H+) x p(H+) + p(D+/H-) x p(H-) *Summation Rule*

PPV = p(D+|H+) x p(H+) / (p(D+/H+) x p(H+) + p(D+/H-) x p(H-))

R = p(H+)/p(H-) *(a priori) Odds Ratio of Hypothesis being true*

PPV = (1-β) x R / ((1-β) x R) + α)

PPV Arithmetic

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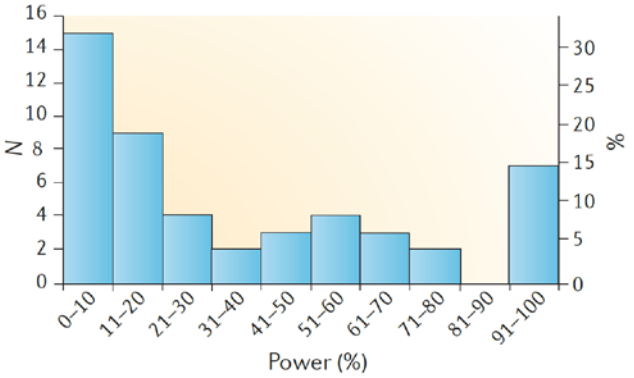
- Why most studies false, ie PPV < ½?

$$0.5 > PPV = \frac{(1-\beta)\,R}{(1-\beta)\,R + \alpha} \quad \rightarrow \quad \alpha > (1-\beta)\,R$$

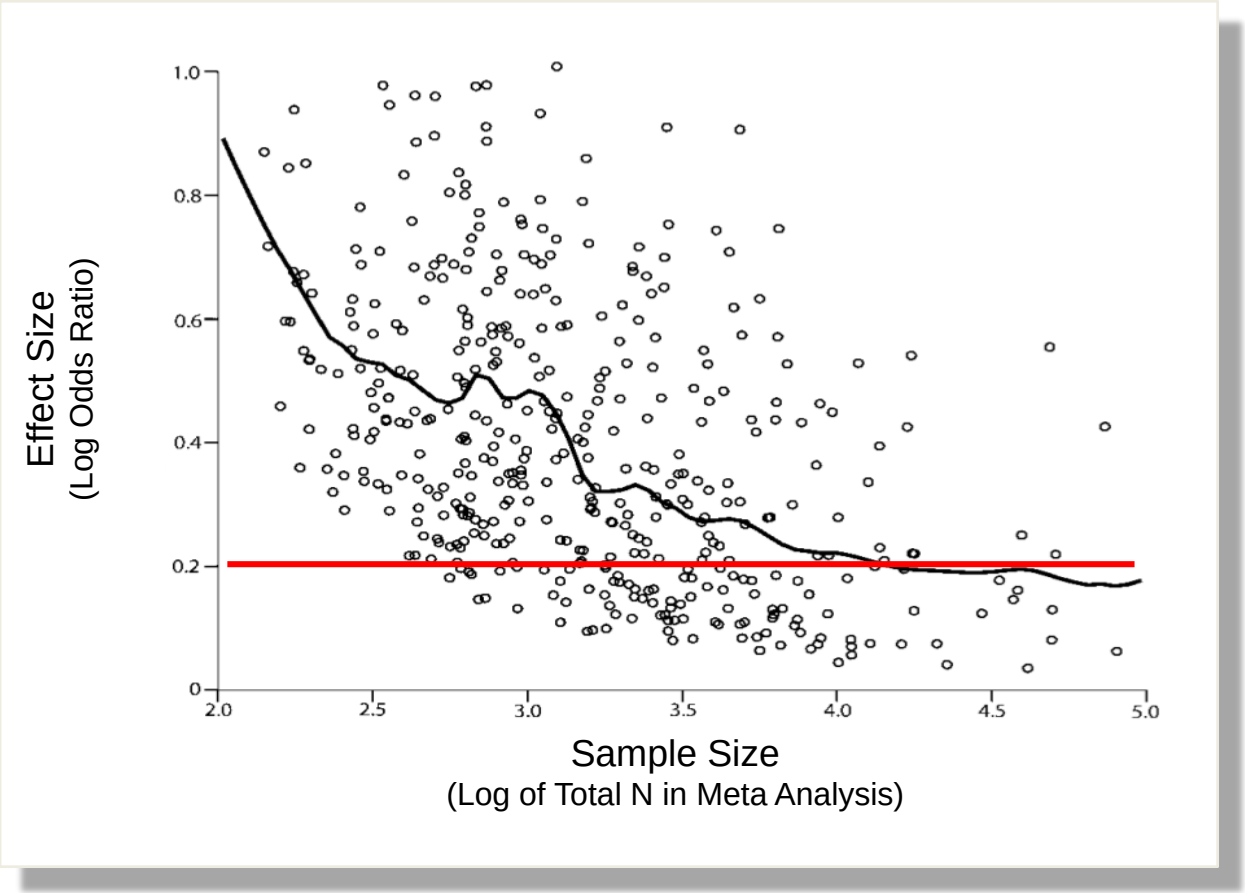
  - Assume power 20%, ie (1-β) = 0.2 (and α=0.05)…
  - 0.05 > 0.20 R → R < 0.05/0.20
  - So PPV < 0.5 if H1:H0 < 1:4; discovery science ?
  - Worse once consider bias…



- PPV highly dependent on Power (since α small)

$$PPV = (1-\beta)\,\frac{R}{R + \alpha/(1-\beta)} \approx (1-\beta)$$

Additional Bias (u)



Ioannidis (2008). "Why most discovered true associations are inflated." *Epidemiology*, 19(5), 640-8

Filing Drawer problem

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Additional Bias (u)

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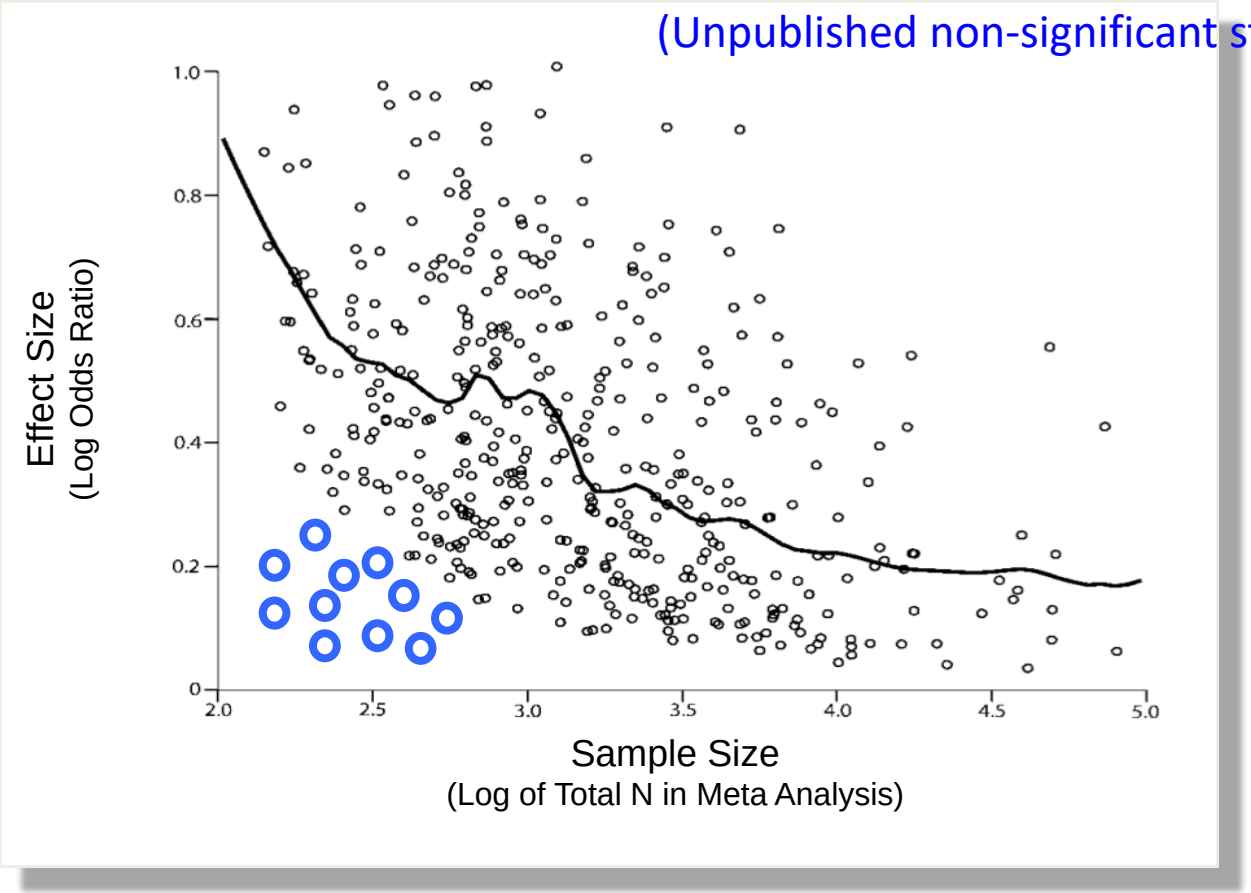
File drawer problem
(Unpublished non-significant studies)



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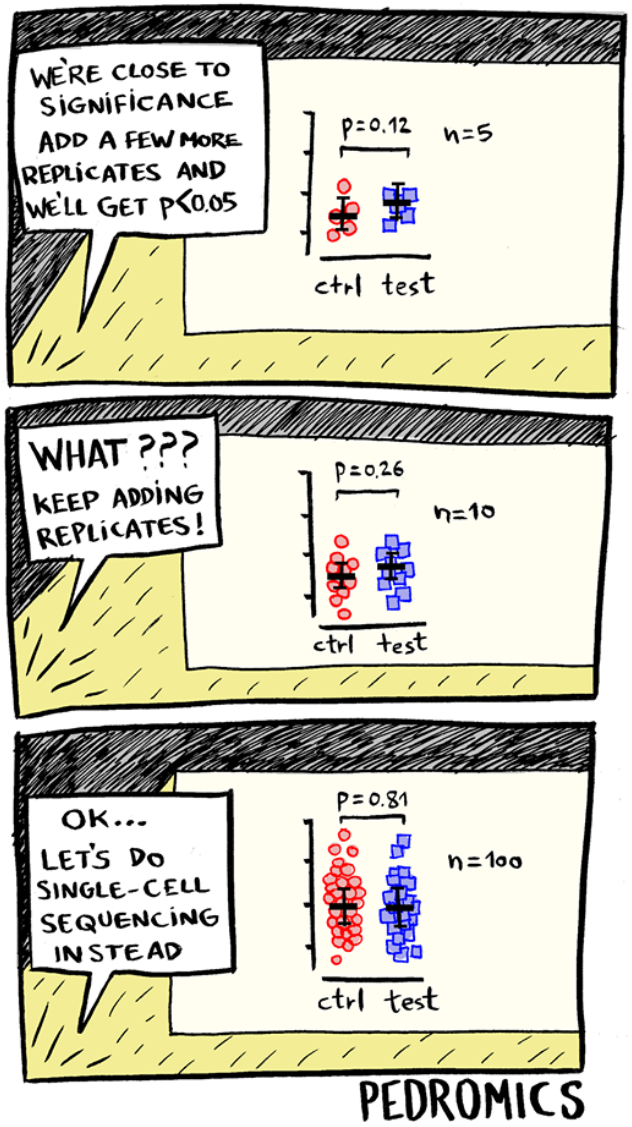
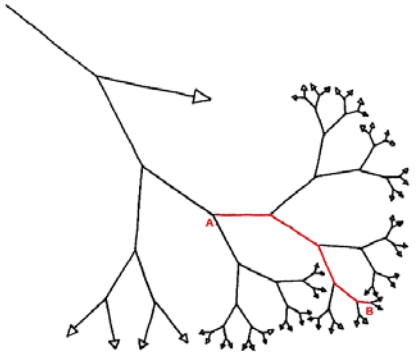
P-Hacking



- Different statistical tests
- Different variables
- Removal of outliers
- Peeking & +/- n = numbers

The Garden of Forking Paths
by Jorge Luis Borges



Additional Bias (u)

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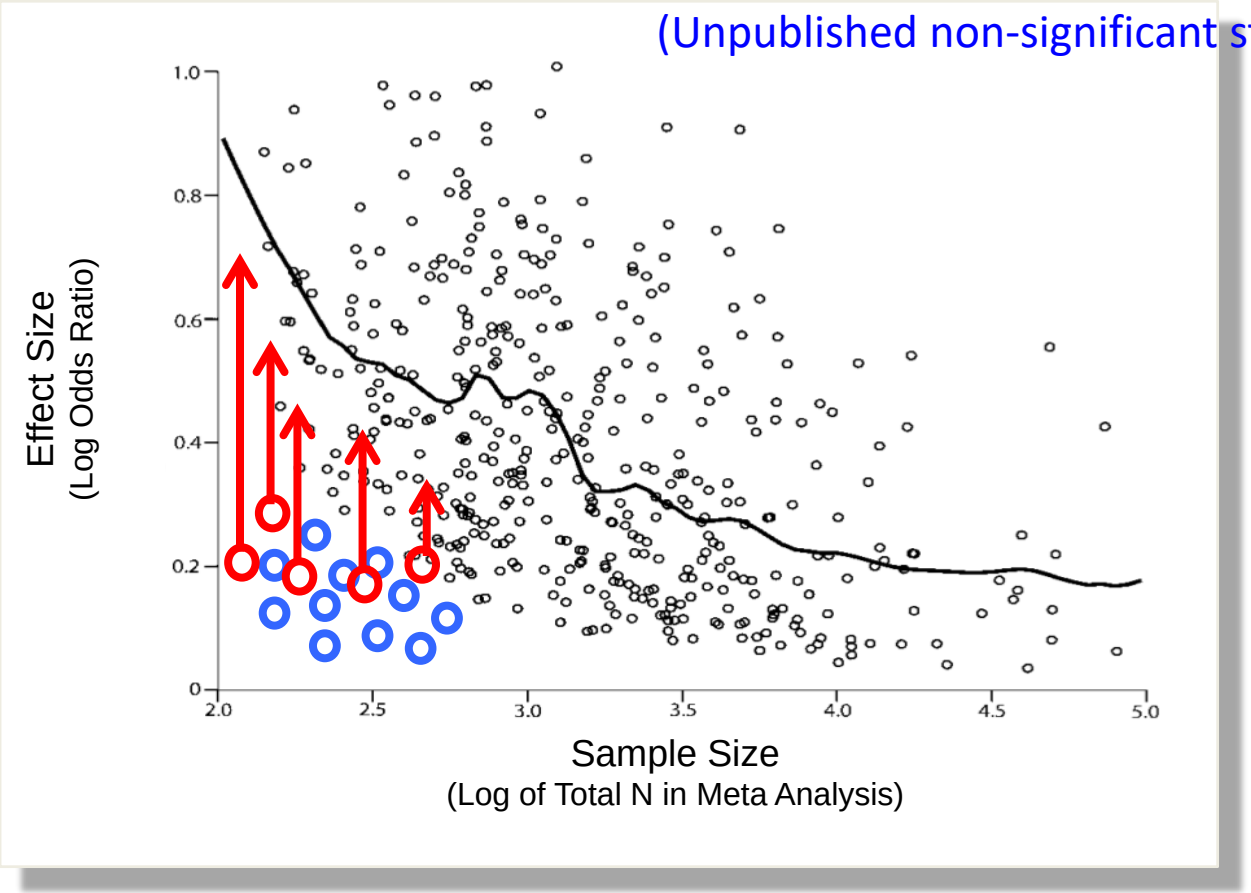
P-hacking
(Fishing or Vibration Effects)

File drawer problem
(Unpublished non-significant studies)



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PPV Arithmetic

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- Adding bias of u:

$$PPV = \frac{(1-\beta)R + u\beta R}{(1-\beta)R + u\beta R + \alpha + u(1-\alpha)}$$

Table 4. PPV of Research Findings for Various Combinations of Power (1 – β), Ratio of True to Not-True Relationships *(R)*, and Bias *(u)*

1 – β	*R*	*u*	Practical Example	PPV
0.80	1:1	0.10	Adequately powered RCT with little bias and 1:1 pre-study odds	0.85
0.95	2:1	0.30	Confirmatory meta-analysis of good-quality RCTs	0.85
0.80	1:3	0.40	Meta-analysis of small inconclusive studies	0.41
0.20	1:5	0.20	Underpowered, but well-performed phase I/II RCT	0.23
0.20	1:5	0.80	Underpowered, poorly performed phase I/II RCT	0.17
0.80	1:10	0.30	Adequately powered exploratory epidemiological study	0.20
0.20	1:10	0.30	Underpowered exploratory epidemiological study	0.12
0.20	1:1,000	0.80	Discovery-oriented exploratory research with massive testing	0.0010

Ioannidis (2005). "Why most published research findings are false"

Piloting

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- Where obtain effect size for new study?
  - From literature? But publication bias (over-estimated)…
  - From pilot experiment? But then need large sample…
  - A priori (e.g, medium effect)? But will reviewers agree… (register!)

Article

Reproducible brain-wide association studies require thousands of individuals

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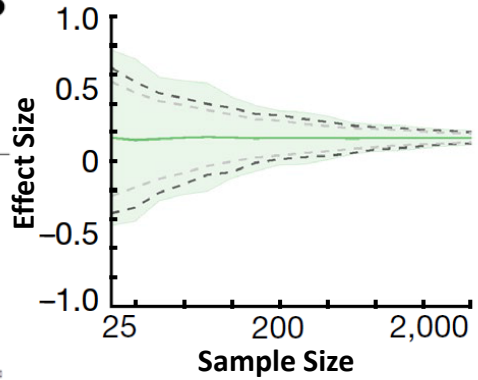
Check for updates

Scott Marek[1,30], Brenden Tervo-Clemmens[2,3,30], Finnegan J. Calabro[4,5], David F. Montez[6], Benjamin P. Kay[6], Alexander S. Hatoum[1], Meghan Rose Donohue[1], William Foran[4], Ryland L. Miller[1,6], Timothy J. Hendrickson[7], Stephen M. Malone[8], Sridhar Kandala[1], Eric Feczko[9,10], Oscar Miranda-Dominguez[9,10], Alice M. Graham[11], Eric A. Earl[9,11], Anders J. Perrone[9,11], Michaela Cordova[11], Olivia Doyle[11], Lucille A. Moore[11], Gregory M. Conan[9,11], Johnny Uriarte[11], Kathy Snider[11], Benjamin J. Lynch[9,12], James C. Wilgenbusch[9,12], Thomas Pengo[7], Angela Tam[13,14,15,16], Jianzhong Chen[13,14,15,16], Dillan J. Newbold[6], Annie Zheng[6], Nicole A. Seider[6], Andrew N. Van[6,17], Athanasia Metoki[6], Roselyne J. Chauvin[6], Timothy O. Laumann[1], Deanna J. Greene[18], Steven E. Petersen[6,17,19,20,21], Hugh Garavan[22], Wesley K. Thompson[23], Thomas E. Nichols[24], B. T. Thomas Yeo[13,14,15,16,25,26], Deanna M. Barch[1,21], Beatriz Luna[3,4], Damien A. Fair[9,10,27,31] & Nico U. F. Dosenbach[6,17,19,28,29,31]



Classical (Frequentist) vs Bayesian Inference

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- Classical "p-value" is *likelihood* of getting a statistic (derived from the data, D), given Null Hypothesis (H0) is true, i.e, that effect size is exactly zero:

$$p(D|H_0)$$

- Bayes Factor (BF) is the *relative evidence* for H1 vs H0 (or vice versa):

$$BF_{10} = \frac{p(D|H_1)}{p(D|H_0)}$$

- …though requires you to specify some **priors** on H1, H0 parameters…
  - "Subjective Bayesians" specify priors based on theory/data (register!)
  - "Objective Bayesians" specify priors as minimal (default) assumptions…

Bayes Factors

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BF_{10}	Evidence
> 100	Extreme evidence for H_1
30 – 100	Very strong evidence for H_1
10 – 30	Strong evidence for H_1
3 – 10	Moderate evidence for H_1
1 – 3	Anecdotal evidence for H_1
1	No evidence
1 – 1/3	Anecdotal evidence for H_0
1/10 – 1/30	Strong evidence for H_0
1/30 – 1/100	Very strong evidence for H_0
< 1/100	Extreme evidence for H_0

- **Most journals** either require **BF of 6** or **10** for registered reports
- We often take **BF_{10} > 10** and **BF_{10} < 1/6** as sufficient

Wagenmakers et al. (2011) J. Pers. Soc. Psych

Bayes Factors

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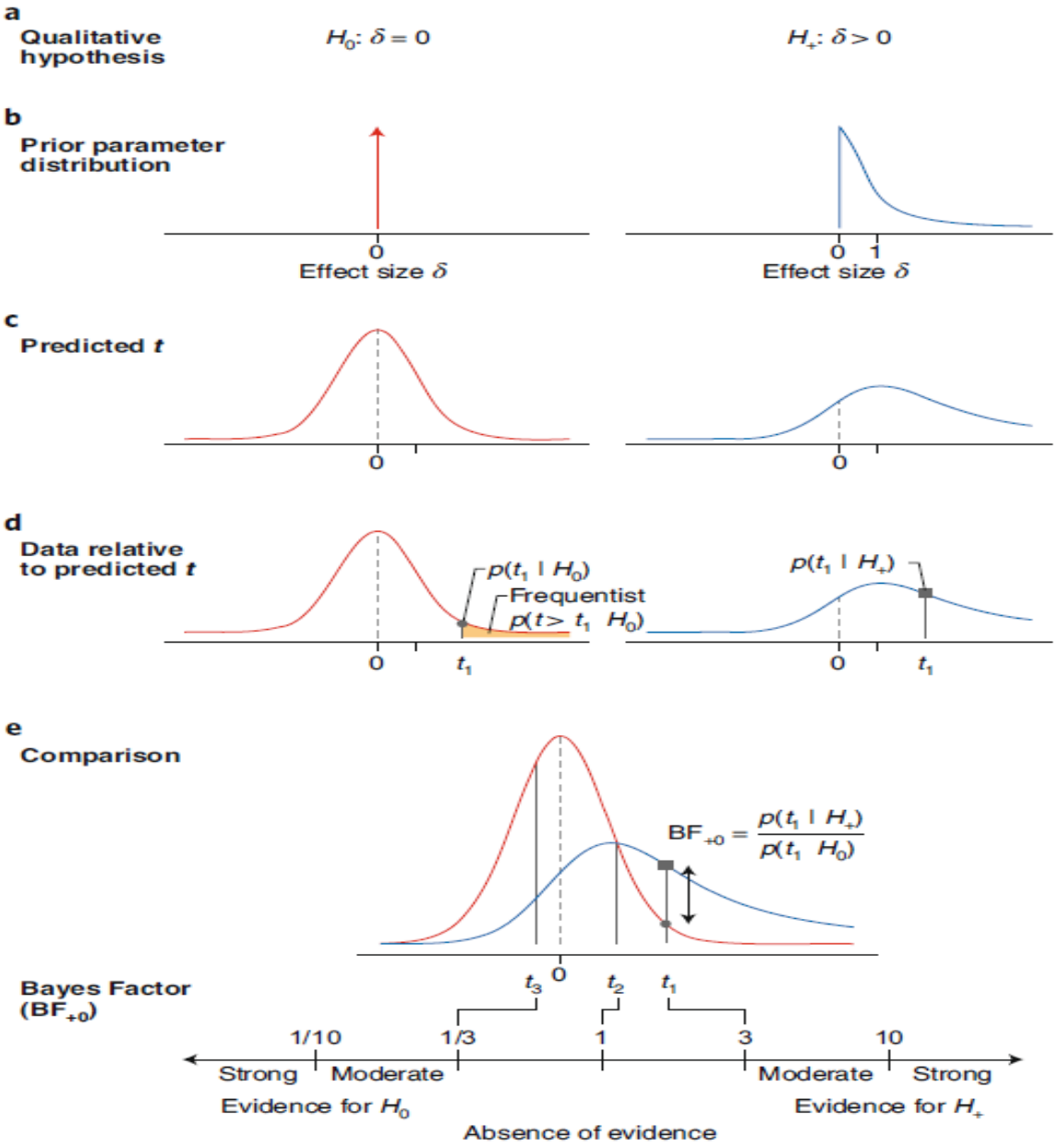

Keysers et al. (2020). Nat. Neurosci.

Classical (Frequentist) vs Bayesian Inference

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Problems of Classical Inference (or advantages of "going Bayesian"):

- A "non-significant" p-value (e.g, *p>.05*) does not mean there is no effect *("absence of evidence is not evidence of absence")…*

  …BFs can quantify evidence for Null (BF01=1/BF10)

- A "significant" p-value can be found for unrealistic/trivial effect sizes…

  …BFs make reference to likely effect sizes…

- The more tests performed, the more likely a "Type I" error (when *p<.05* but H0 is true)…

  …BFs can be combined across data (or prior adjusted)

- You should specify sample size (stopping rule) in advance (you cannot "top-up" observations just to try to get *p<.05*)...

  …BFs reflect belief-updating, and allow Sequential Designs

Dienes (2011) Perspectives Psych. Sci.

“Fixed N” design

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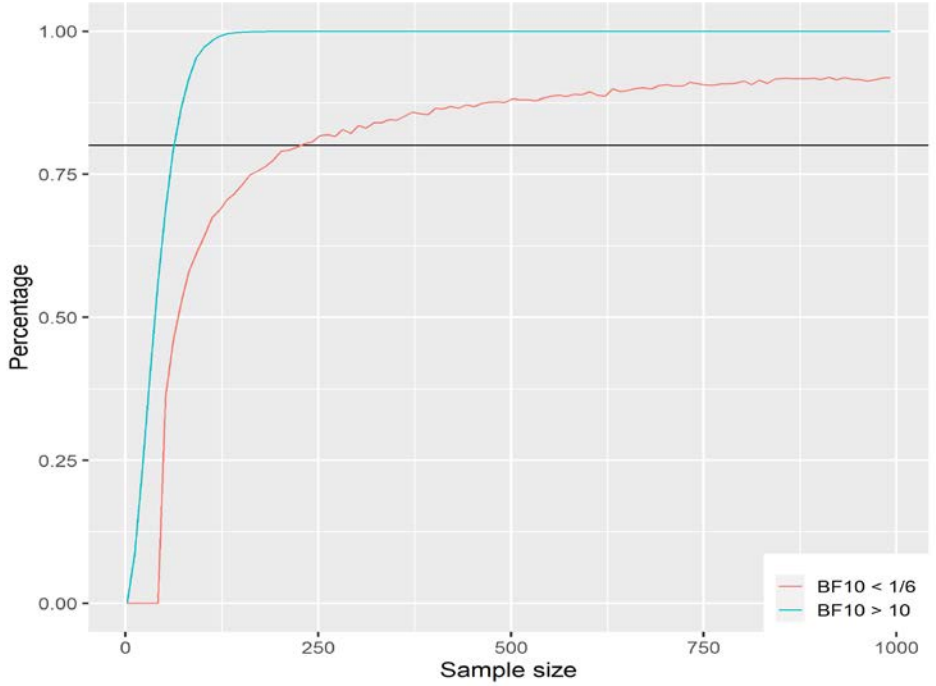

Effect size	Max N	Misleading evidence	Strong evidence	Costs fMRI experiment
0.5	72	0.0003 %	80 %	£ 39,600
0.0	232	0.0011 %	80 %	£ 127,600

Slides thanks to Alex Quent

https://jaquent.github.io/post/bayesian-sequential-designs-are-superior/

Sequential design

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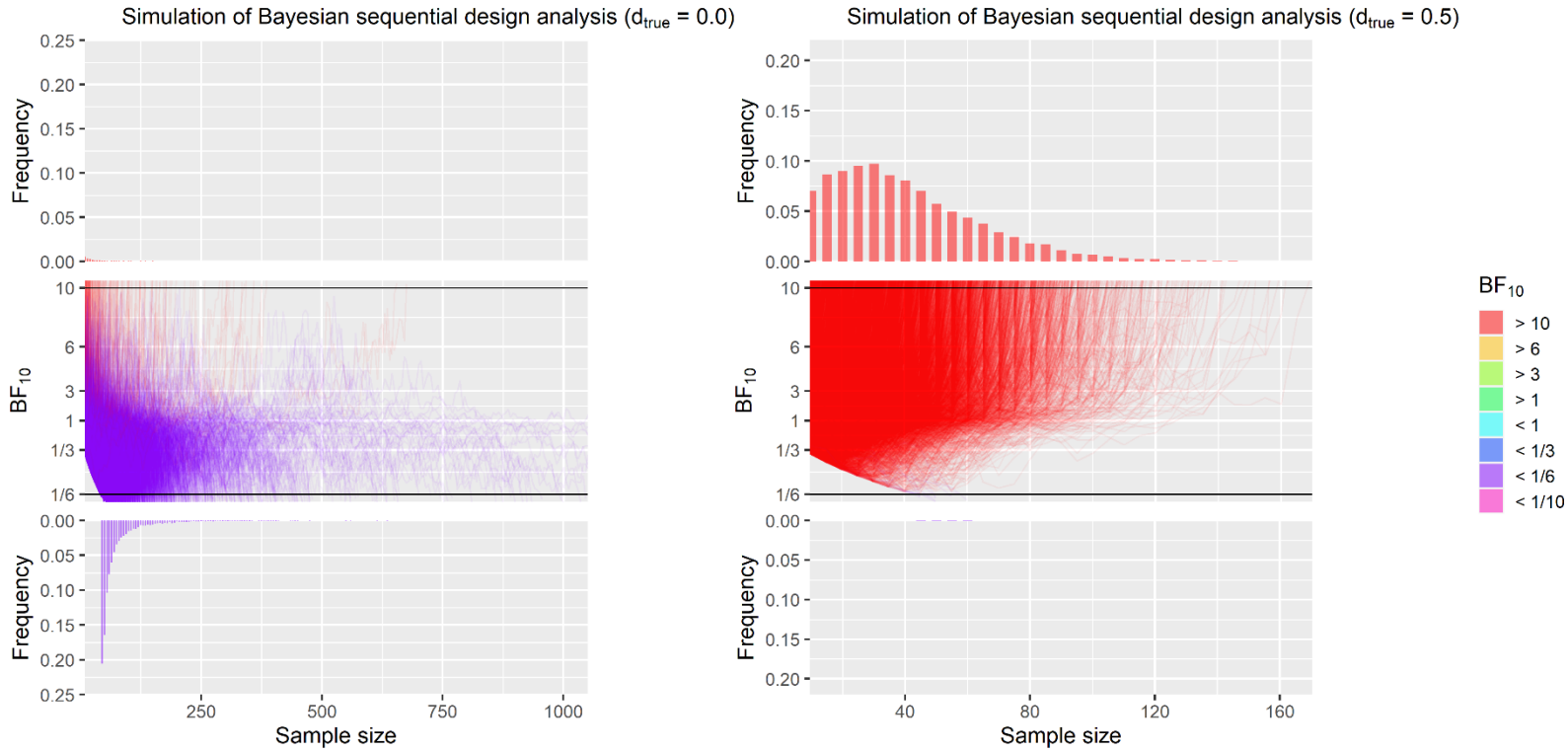

Effect size	Max N	Mean N	Misleading evidence	Strong evidence	Costs fMRI experiment
0.5	170	41	0.13 %	100 %	£ 22,550
0.0	2765	83	2.95 %	100 %	£ 45,650

Slides thanks to Alex Quent

https://jaquent.github.io/post/bayesian-sequential-designs-are-superior/

“Max N” Sequential design

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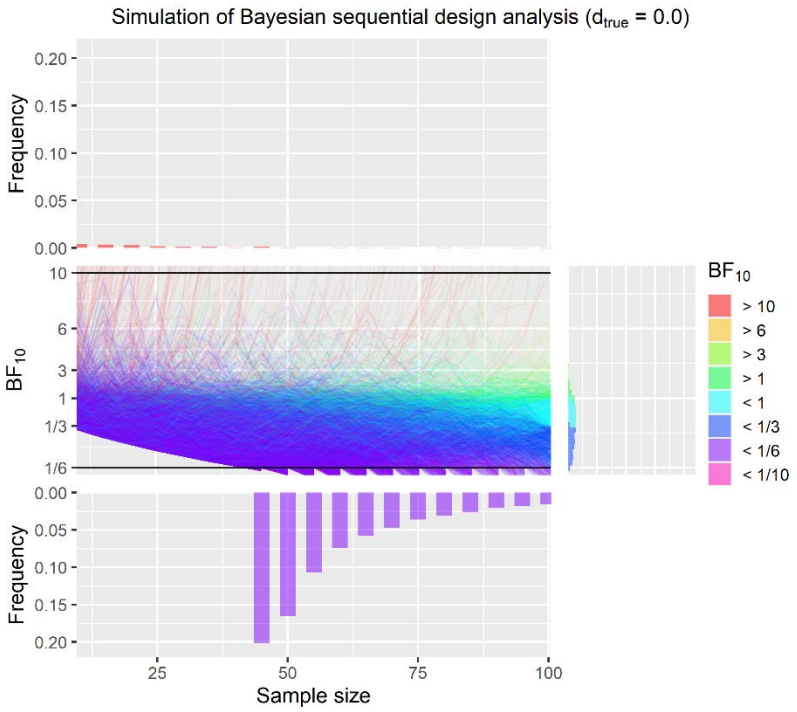

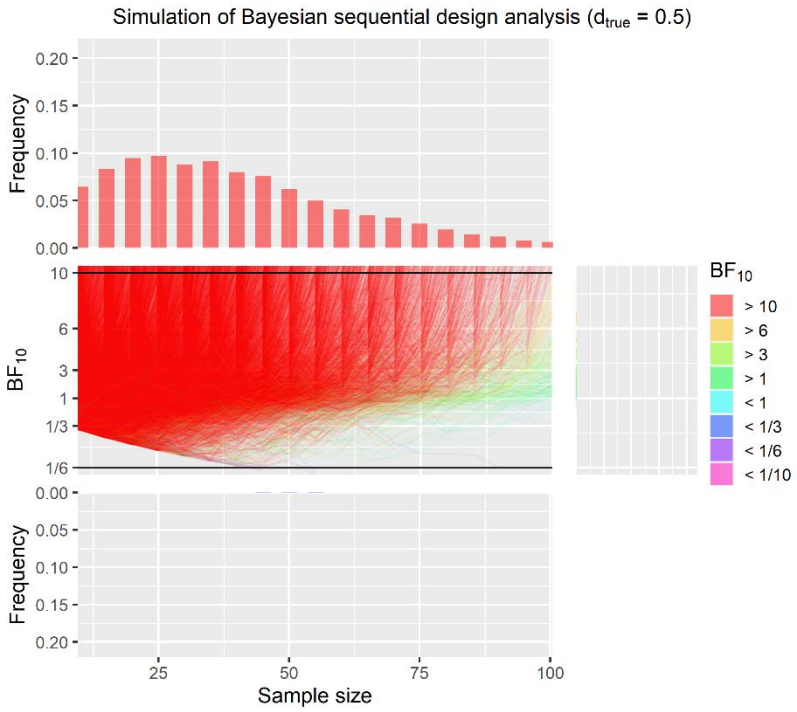

Effect size	Max N	Mean N	Misleading evidence	Strong evidence	Costs fMRI experiment
0.5	100	39	0.12 %	98 %	£ 21,450
0.0	100	58	2.31 %	80 %	£ 44,138

Slides thanks to Alex Quent

https://jaquent.github.io/post/bayesian-sequential-designs-are-superior/

Comparison

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Fixed-N Design

Effect size	Max N	Misleading evidence	Strong evidence	Costs fMRI experiment
0.5	72	0.0003 %	80 %	£ 39,600
0.0	232	0.0011 %	80 %	£ 127,600

Sequential design

Effect size	Max N	Mean N	Misleading evidence	Strong evidence	Costs fMRI experiment
0.5	170	41	0.13 %	100 %	£ 22,550
0.0	2765	83	2.95 %	100 %	£ 45,650

Sequential, Max-N design

Effect size	Max N	Mean N	Misleading evidence	Strong evidence	Costs fMRI experiment
0.5	100	39	0.12 %	98 %	£ 21,450
0.0	100	58	2.31 %	80 %	£ 44,138

Slides thanks to Alex Quent

https://jaquent.github.io/post/bayesian-sequential-designs-are-superior/

Overview

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- Registration
- Statistical analysis
  - Power and PPV
  - Bayesian Statistics
  - Sequential Designs
- Sharing Data and Code
  - FAIR principles
  - Incentivising
  - GDPR
- Publication
- Research Culture

Definitions

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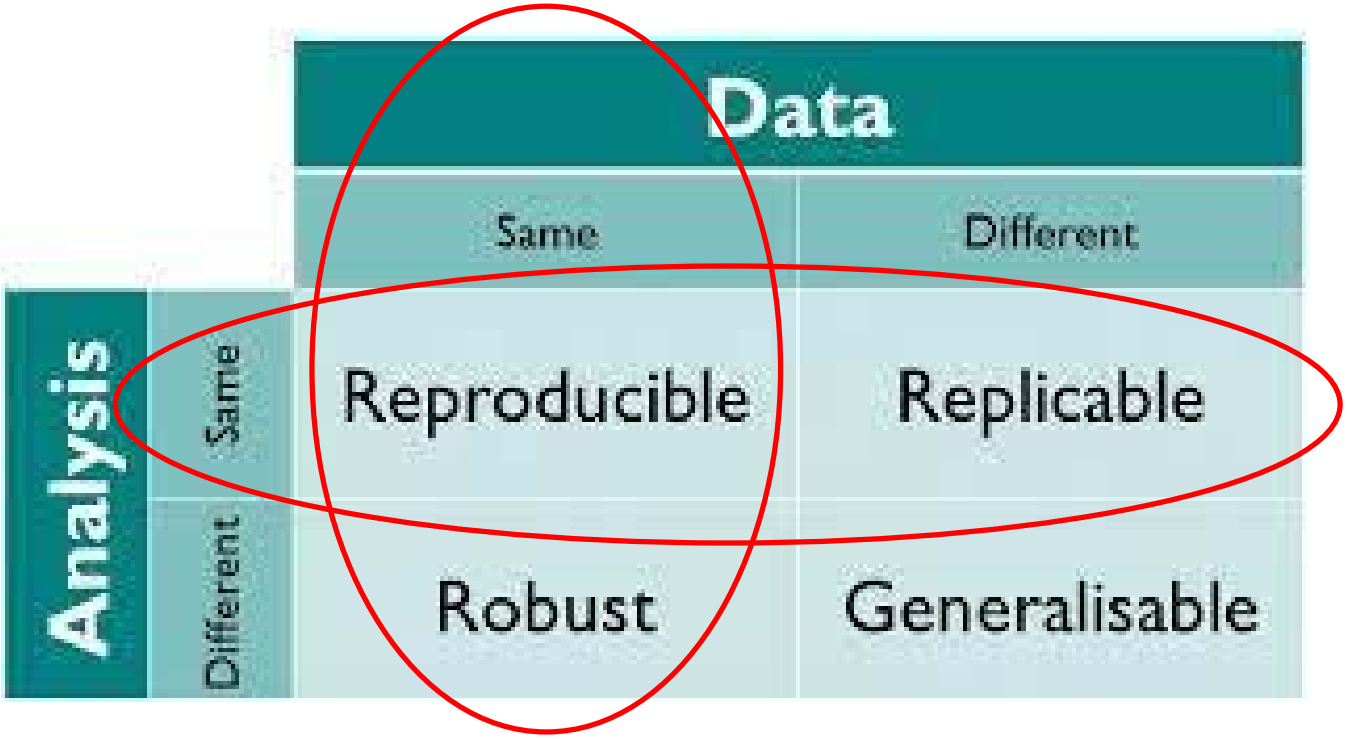

https://the-turing-way.netlify.app/reproducible-research/overview/overview-definitions.html

Sharing Data

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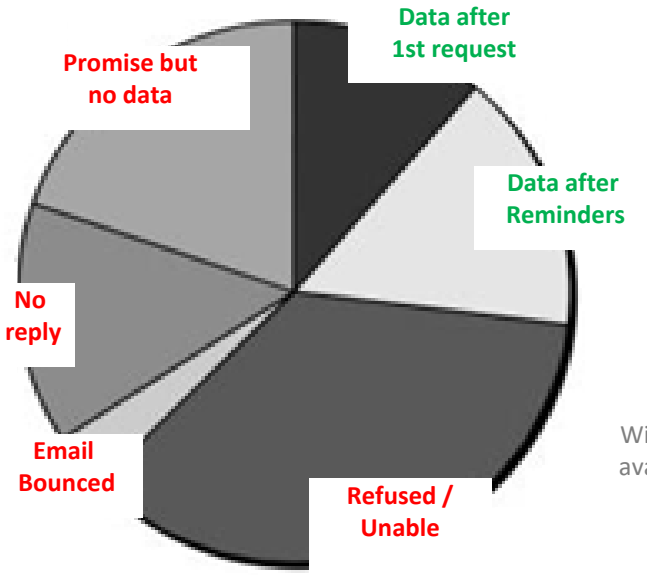

Wicherts, Borsboom, Kats & Molenaar (2006). The poor availability of psychological research data for reanalysis. *American Psychologist*, *61*(7), 726.

- What to share?
- Where to share?
- How to share?
- When to share?

What to Share?

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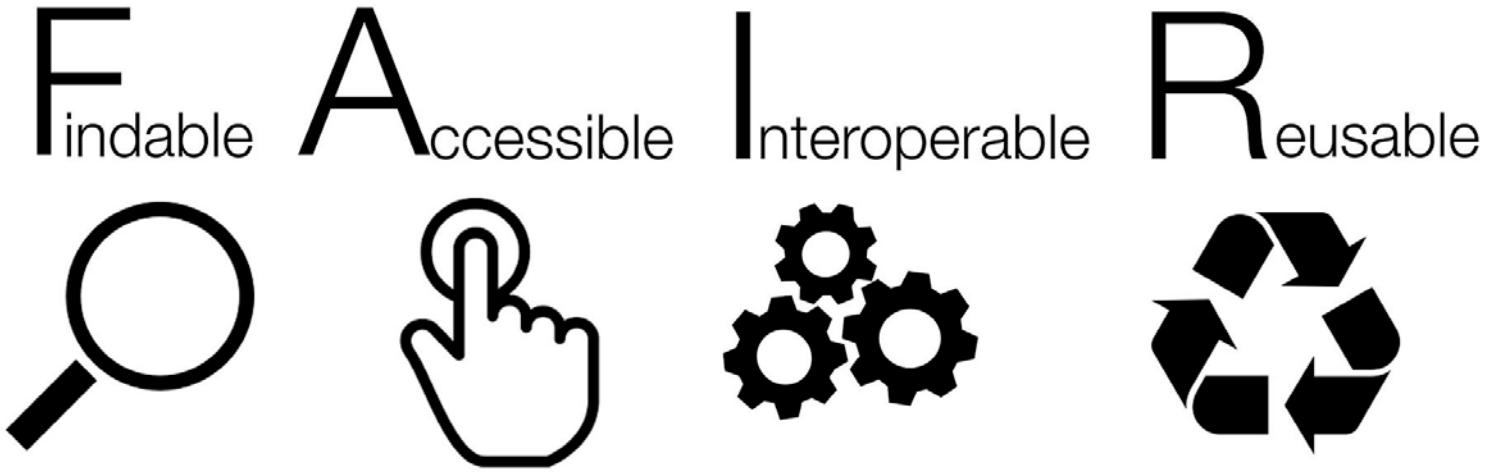

Organization for Human Brain Mapping
Advancing Understanding of the Human Brain

Committee on Best Practice in Data Analysis and Sharing (COBIDAS)
https://www.humanbrainmapping.org/i4a/pages/index.cfm?pageID=3728

What to Share?

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- Sufficient for someone to reproduce your results
- Minimal: raw data and analysis scripts to results in paper
- Non-proprietary formats
- Conventional data formats, eg BIDS for neuroimaging
- Sufficient documentation (data paper?)

https://bids.neuroimaging.io/

Where to Share?

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- Small, non-personal or consented (GDPR) data:
  - open on personal website (but DOI?), university repository, OSF…
  - http://neurovault.org for imaging effect size maps
- Large, non-personal or consented data:
  - Public websites like https://figshare.com/, or https://openneuro.org/ for neuroimaging
- Personal data with limited consent
  - managed access, electronic Data Usage Agreements (DUAs)
- Personal, unconsented data
  - only by ethical approval / collaboration agreement / DTA / re-consent
- Synthetic data with same statistical properties – anywhere!

When to Share?

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- As soon as possible, even pre-publication!
  - Unwarranted fear of scooping?

- During review (but reviewer anonymity?)
- Mandatory on publication!?
  - (In principle) reproducibility is a cornerstone of Science…

Incentivising Sharing?

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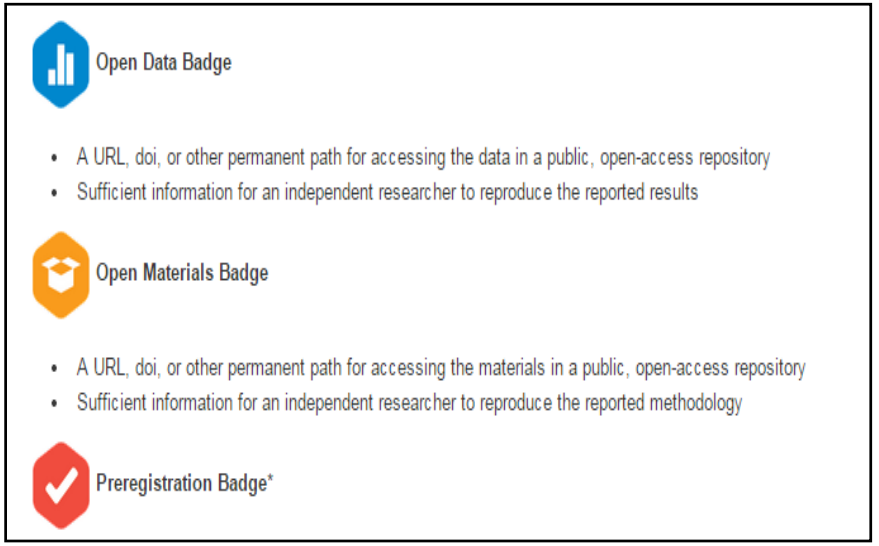
- Data Papers

- Kite Marking



- Reproduction Papers (citation inheritance)?

GDPR

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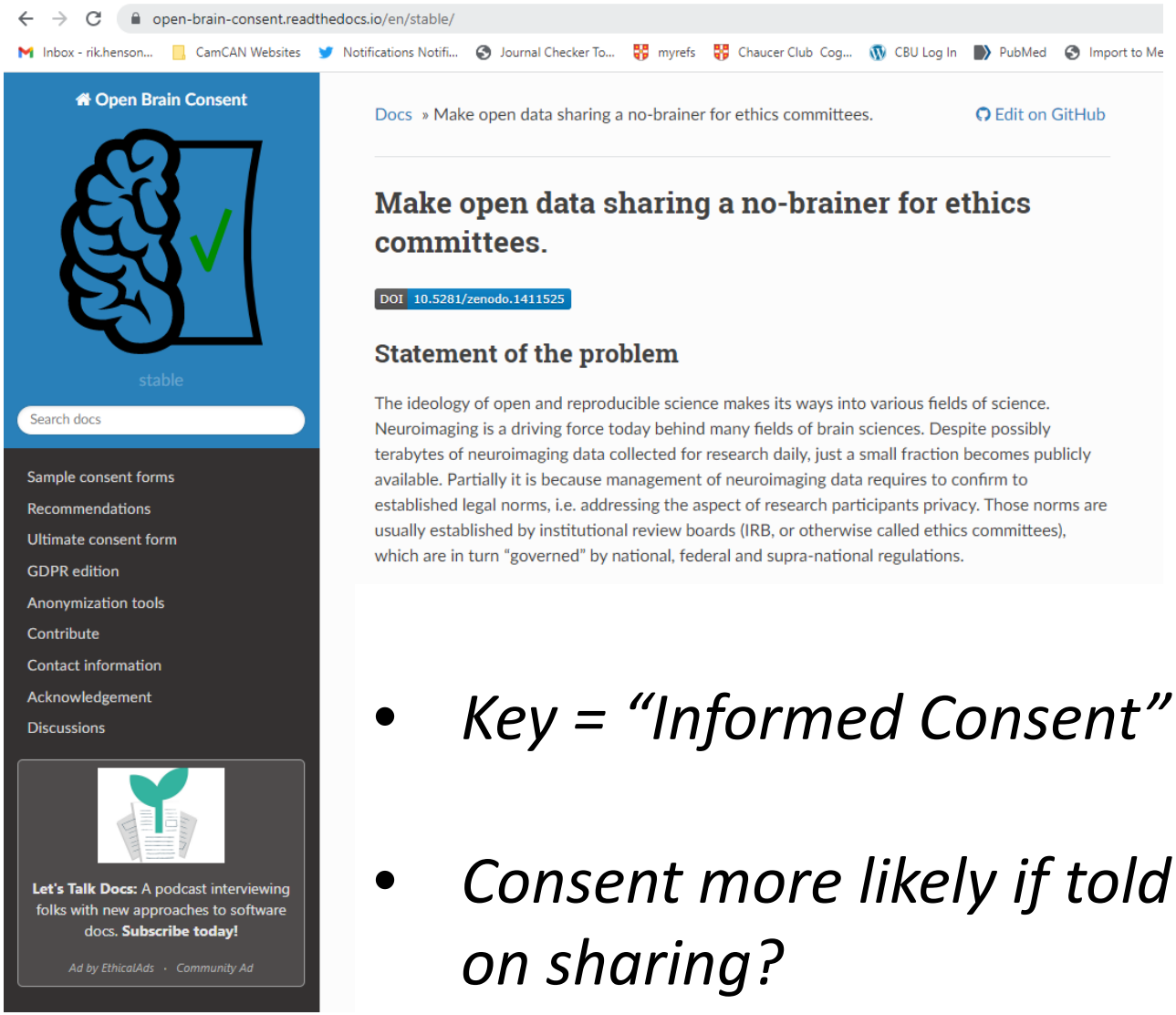

- *Key = "Informed Consent"*
- *Consent more likely if told restrictions on sharing?*

Managed Access

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CBSU Publications

Not secure | www.mrc-cbu.cam.ac.uk/publications/opendata/

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Using cognitive theory and innovations in neuroscience to understand and improve mental wellbeing across the lifespan

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CBSU Publications

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To search for specific data sets, please use the CBSU Bibliography search form

Showing page < 3 > of 9

open science

The missing link? Testing a schema account of unitization

Authors:	TIBON, R., GREVE, A., HENSON. R.
Reference:	*Memory & Cognition*
Year of publication:	In Press
CBU number:	8267
Open Data available, click to request	

Impact of Culture on Autobiographical Life Structure in Depression

Authors:	Jobson, L., Miskon, N., DALGLEISH, T., Hill, E., Golden-A-M., Zulkefly, S., & Mukhtar, F.
Reference:	*British Journal of Clinical Psychology*

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- I will receive access to de-identified data and will not attempt to establish the identity of, or attempt to contact any of the participants.
- I will not publish or disclose any information in a way that would allow the identity of any individual participants to become known.
- I will only use the data for the purposes of non-commercial, ethically approved research or teaching as specified above. I will seek approval from the MRC CBU if I wish to use the data for any other purpose.
- I agree to store the data securely.
- I will not disclose the data to any third parties beyond my immediate research team
- I will require any members of my team with whom I do share the data to comply with these terms and conditions
- I will comply with any rules and regulations imposed by my institution and its institutional review board when requesting and using the data.
- I understand that determining whether ethical approval is needed for the use of the data and gaining that approval is my responsibility.
- I understand that the CBU cannot guarantee exclusive use of these data or police potential overlaps of interest between researchers who request the data.
- I understand that it is my responsibility to check the data for errors, and that the MRC CBU is not responsible for any consequences of unreported errors in the data.
- I agree to make any errors that I discover in this data known to MRC CBU as soon as possible.
- I agree to acknowledge the MRC CBU in any output arising from the use of the data.
- I agree to make any publications that arise from use of the data open-access.
- I agree that should any data I derive from this data set appear in a publication, I will make that derived data, as well as any processing scripts used to produce that derived data, available on a suitable open-access data repository. I will also notify the MRC CBU where the data has been made available.

(Dangers of Open Data?)

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The Subterranean War on Science

STEPHAN LEWANDOWSKY, MICHAEL E. MANN, LINDA BAULD, GERARD HASTINGS, AND ELIZABETH F. LOFTUS

TAGS: COGNITIVE PSYCHOLOGY | EXPERIMENTAL PSYCHOLOGY | FALSE MEMORY | PREJUDICE

Science denial kills. More than 300,000 South Africans died needlessly in the early 2000s because the government of President Mbeki preferred to treat AIDS with garlic and beetroot rather than antiretroviral drugs (Chigwedere, Seage, Gruskin, Lee, & Essex,2008). The premature death toll from tobacco is staggering and historians have shown how it was needlessly inflated by industry-sponsored denial of robust medical evidence (Proctor, 2011). The US now faces the largest outbreak of whooping cough in decades, in part because of widespread denial of the benefits of vaccinations (Rosenau, 2012). According to the World Health Organization, climate change is already claiming more than 150,000 lives annually (Patz, Campbell-Lendrum, Holloway, & Foley, 2005), and estimates of future migrations triggered by unmitigated global warming run as high as 187 million refugees (Nicholls et al., 2011). A common current attribute of denial is that it side-steps the peer-reviewed literature and relies on platforms such as internet blogs or tabloid newspapers to disseminate its dissent from the scientific mainstream. In contrast, the publication of dissenting views in the peer-reviewed literature does not constitute denial.

The tragic track record of denial has stimulated research into its political, sociological, and psychological underpinnings (Dunlap, 2013; Jacobson, Targonski, & Poland, 2007;

About the Authors

Stephan Lewandowsky is with the Department of Psychology at the University of Bristol, UK, and University of Western Australia; **Michael E. Mann** is with the Departments of Meteorology & Geosciences at Penn State University; **Linda Bauld** and **Gerard Hastings** are with the Centre for Tobacco Control Research at the University of Stirling, UK; and **Elizabeth F. Loftus** is with the Department of Psychology and Social Behavior at the University of California, Irvine.

Related

MYTH: EYEWITNESS TESTIMONY IS THE BEST KIND OF EVIDENCE
Activities in this unit reveal how eyewitness testimony is subject to unconscious memory distortions and biases even among the most confident of witnesses. … More

MYTH: TRAUMATIC MEMORIES ARE OFTEN REPRESSED AND LATER RECOVERED
This provides students with an opportunity to see that, often, analyses may lead to conclusions

Data Usage Agreement (DUA)

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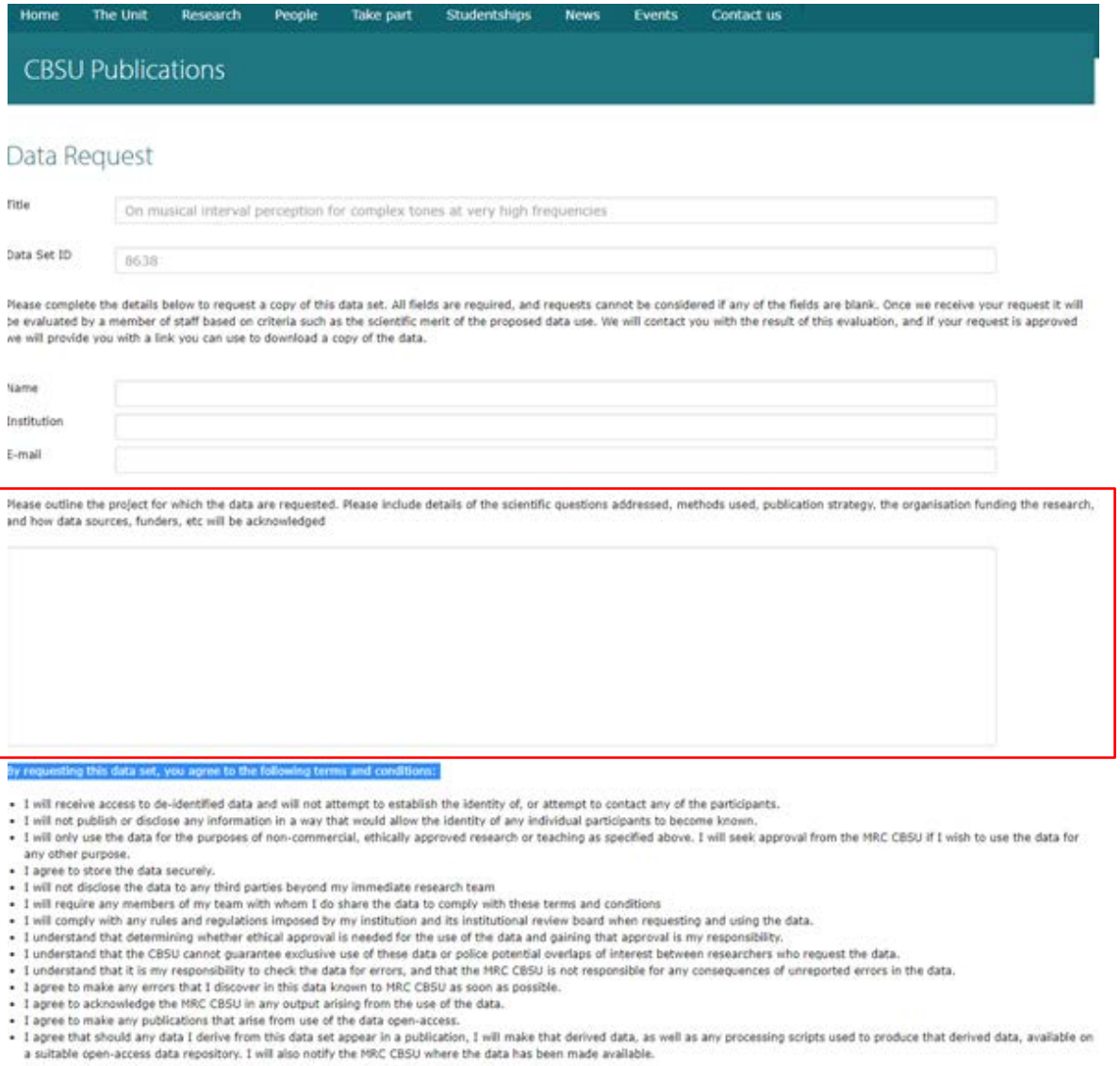

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CBSU Publications

Data Request

Title: On musical interval perception for complex tones at very high frequencies

Data Set ID: 8638

Please complete the details below to request a copy of this data set. All fields are required, and requests cannot be considered if any of the fields are blank. Once we receive your request it will be evaluated by a member of staff based on criteria such as the scientific merit of the proposed data use. We will contact you with the result of this evaluation, and if your request is approved we will provide you with a link you can use to download a copy of the data.

Name

Institution

E-mail

Please outline the project for which the data are requested. Please include details of the scientific questions addressed, methods used, publication strategy, the organisation funding the research, and how data sources, funders, etc will be acknowledged

By requesting this data set, you agree to the following terms and conditions:

- I will receive access to de-identified data and will not attempt to establish the identity of, or attempt to contact any of the participants.
- I will not publish or disclose any information in a way that would allow the identity of any individual participants to become known.
- I will only use the data for the purposes of non-commercial, ethically approved research or teaching as specified above. I will seek approval from the MRC CBSU if I wish to use the data for any other purpose.
- I agree to store the data securely.
- I will not disclose the data to any third parties beyond my immediate research team
- I will require any members of my team with whom I do share the data to comply with these terms and conditions
- I will comply with any rules and regulations imposed by my institution and its institutional review board when requesting and using the data.
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Open Code

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Free
Version Control
Multiple Users

https://github.com/

https://software-carpentry.org/

R (for statistics)

Python (for anything!)

Overview

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- Registration
- Statistical analysis
- Sharing Data and Code
  - FAIR principles
  - Incentivising
  - GDPR
- Publication
  - Open Access
  - Preprints
  - Open Review
- Research Culture

PAYWALL
The Business of Scholarship

STATEMENT | 4 September 2018

'Plan S' and 'cOAlition S' – Accelerating the transition to full and immediate Open Access to scientific publications

With the increasing pace of scientific discovery and growing public demand for reliable information, there has never been a greater need for immediate, universal, access to the latest research findings. But with many scientific journals behind paywalls not everyone can get hold of this knowledge. 'Knowledge is power' and I firmly believe that free access to all scientific publications from publicly funded research is a moral right of citizens. Two years ago, on 27 May 2016, all Member States of the European Union committed to achieve this goal by 2020. It is one of the most important political commitments on science of recent times and puts Europe at the forefront of the global transition to open

- UKRI adopted April 2022
- Similar initiative in US

Open Publication

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- Open Access (OA): Public-funded (tax payer) money?
- Gold OA but minimal Author Processing Charge (APC)?
- Free journals (funded by government eg UKRI)?
- More radical solutions, eg Octopus, https://www.octopus.ac/

frontiers in COMPUTATIONAL NEUROSCIENCE

EDITORIAL
published: 15 November 2012
doi: 10.3389/fncom.2012.00094

An emerging consensus for open evaluation: 18 visions for the future of scientific publishing

Nikolaus Kriegeskorte[1]*, *Alexander Walther*[1] and *Diana Deca*[2]

[1] Medical Research Council Cognition and Brain Sciences Unit, Cambridge, UK
[2] Institute of Neuroscience, Technische Universität München, Munich, Germany
*Correspondence: nikokriegeskorte@gmail.com

Edited by:
Misha Tsodyks, Weizmann Institute of Science, Israel

Reviewed by:
Misha Tsodyks, Weizmann Institute of Science, Israel

Preprints

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bioRxiv

THE PREPRINT SERVER FOR BIOLOGY

https://www.biorxiv.org/

- Pros and Cons of peer-review as gateway to publication

  Pro: Publication Bias (Pfizer review AZ's paper submitted to FDA?)

  Con? COVID examples

Open Review

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- Post-publication of Reviews (eg PubMed Commons, F1000)...
- ...continuing dialogue linked to original paper ("conversation")

- Double-blind Reviews...
- ...or even identified Reviewers (or unique ID within system?)
- Publish reviews

https://asapbio.org/publishyourreviews

- Quality of Reviews – overworked, incentivize (£, or CVs, eg Publons)

Kite Marking Again

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Transparency and Openness Promotion (TOP) guidelines

https://www.cos.io/initiatives/top-guidelines

↓ HARKing ↓ P-hacking
+ Feedback

Null results

Materials; Code

↑ Reliability
↓ Variability

Re-analysis + pooling data

Quality control

Overview

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- Registration
- Statistical analysis
- Sharing Data and Code
- Publication
  - Open Access
  - Preprints
  - Open Review
- Research Culture
  - DORA
  - CRediT
  - Narrative CVs

Publish or Perish

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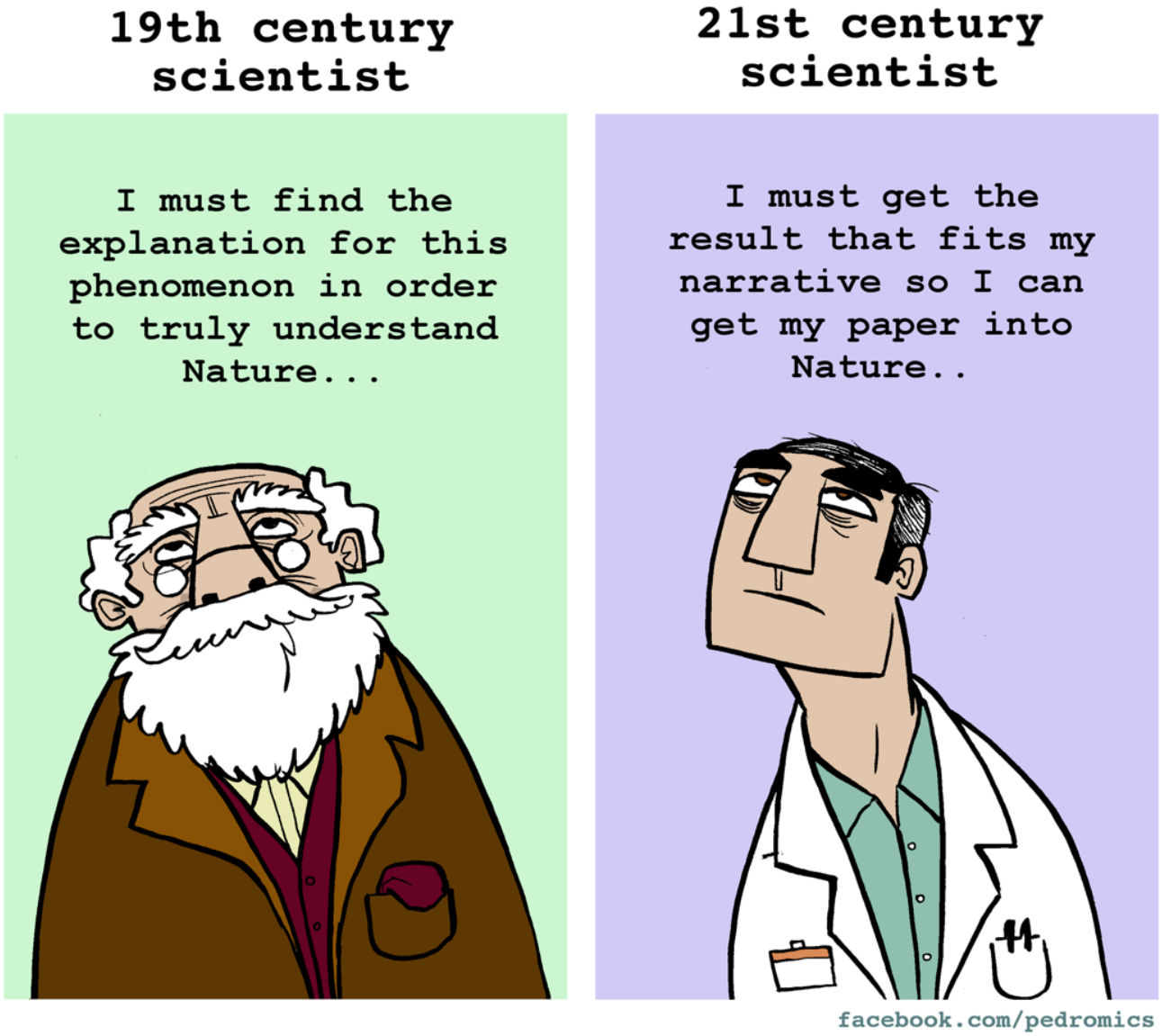
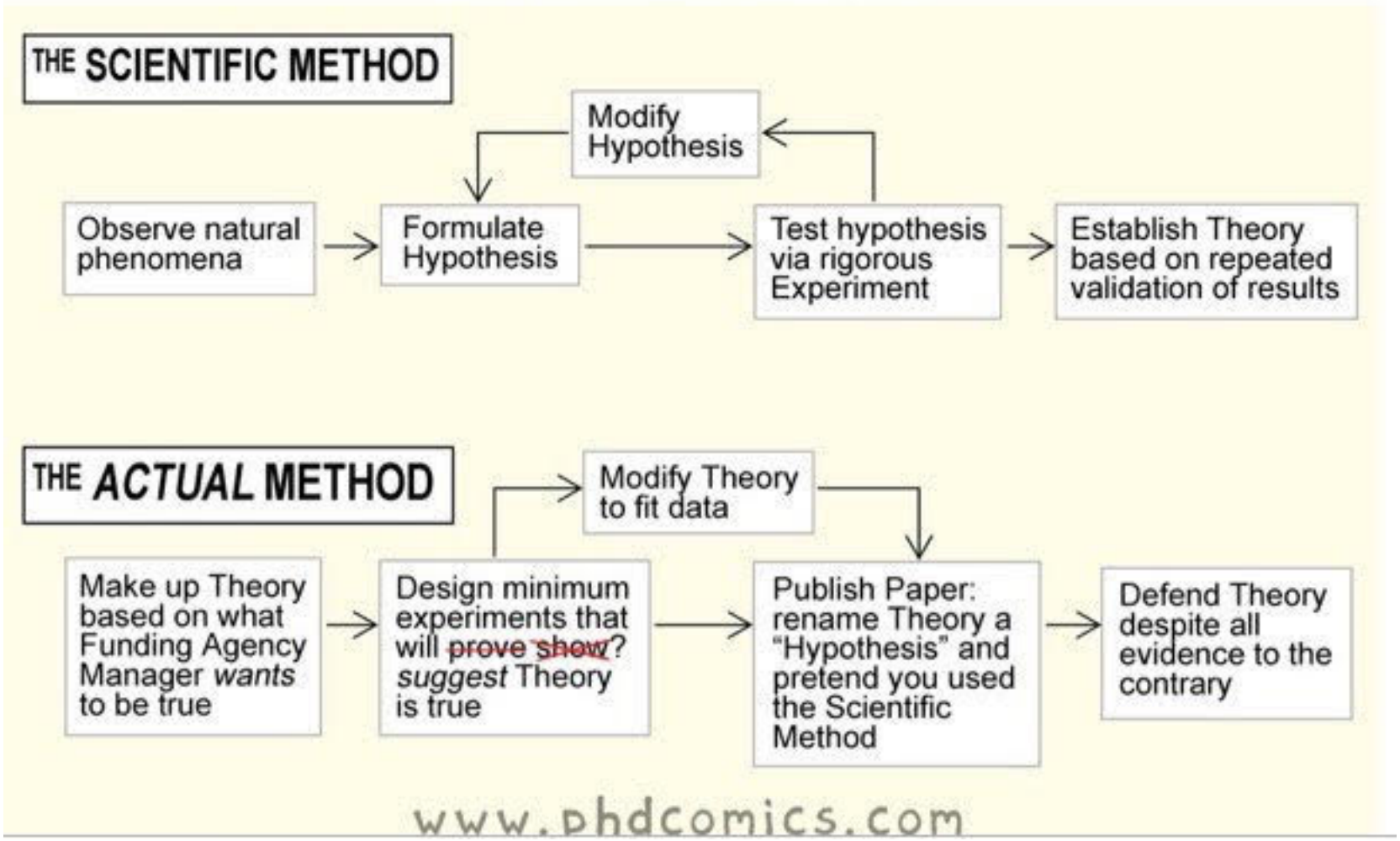


Real Scientific Method



Impact Factor

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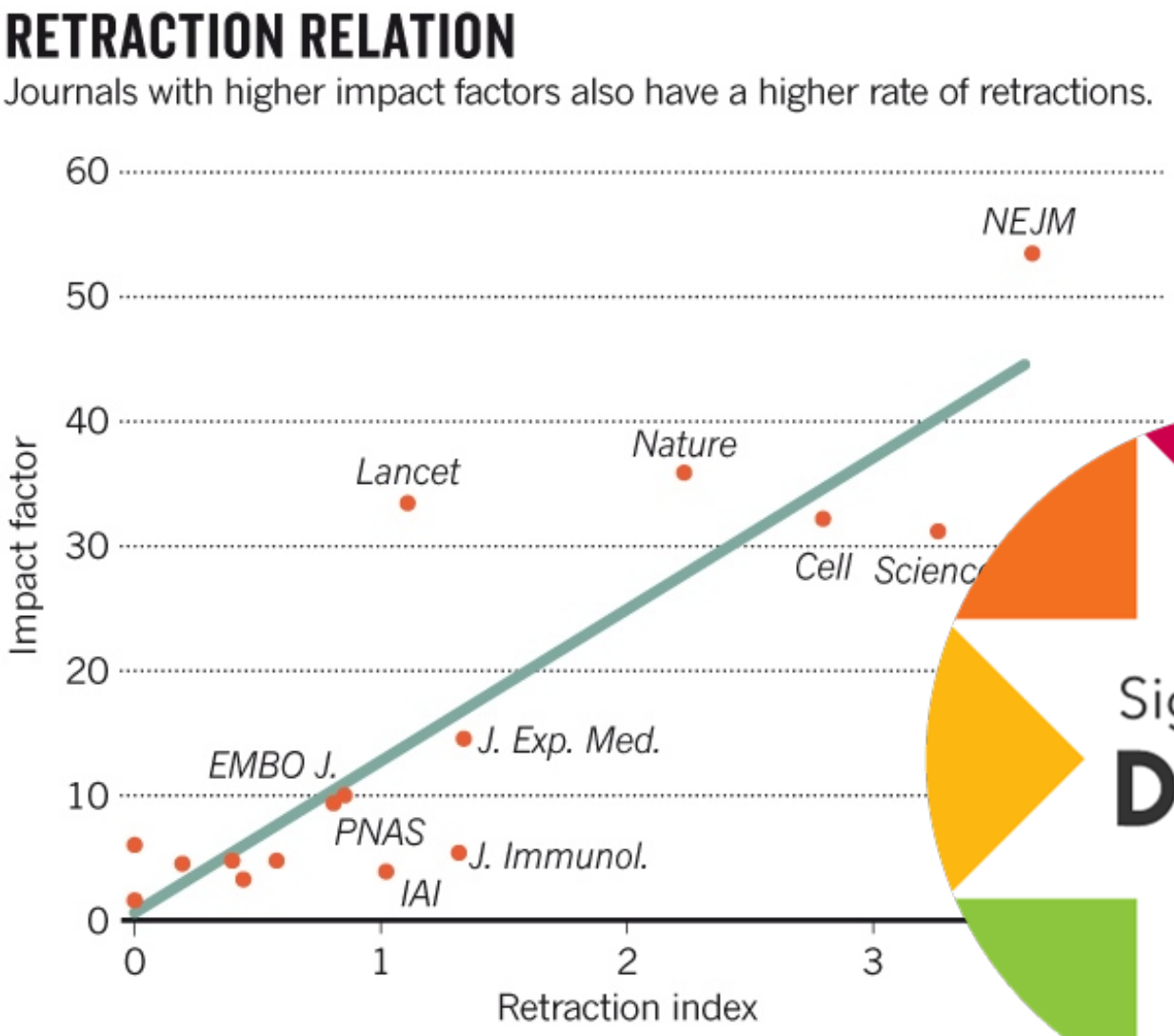

Other Issues

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- CRediT (Contributor Roles Taxonomy):

  Eg: "Zhang San: Conceptualization, Methodology, Software Priya Singh.: Data curation, Writing- Original draft preparation. Wang Wu: Visualization, Investigation. Jan Jansen: Supervision.: Ajay Kumar: Software, Validation.: Sun Qi: Writing-Reviewing and Editing"

- Reward «team science», eg corporate authorship

Alternative CVs

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- Narrative CVs
  - Royal Society's "Resume for Researchers" (R4R)
    - How have you contributed to:1) knowledge, 2) develop individuals, 3) research community, 4) society?
  - Description of best work; no Impact Factors!

- Employers:
  - Read papers rather than note journal
  - Recruitment & Promotion: seek evidence of commitment to Open Practices
  - Reward team/community/support work – "scientific citizenship"

Guidance/Hope

MRC Cognition and Brain Sciences Unit

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CENTER FOR OPEN SCIENCE

https://osf.io/

UKRN

UK Reproducibility Network

https://www.ukrn.org/

ReproducibiliTea

https://reproducibilitea.org/

BNA British Neuroscience Association

Be InCredible

https://www.bnacredibility.org.uk/

Overview

MRC Cognition and Brain Sciences Unit

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- Registration
  - Study Registration (eg OSF)
  - Registered Reports
  - Pre-Registration Posters
- Statistical analysis
  - Power and PPV
  - Bayesian Statistics
  - Sequential Designs
- Sharing Data and Code
  - FAIR principles
  - Incentivising
  - GDPR
- Publication
  - Open Access
  - Preprints
  - Open Review
- Research Culture
  - DORA
  - CRediT
  - Narrative CVs