

Resources for anyone
(and everyone) to make
their science more open

AKA: Things I Wish I Knew 5 Years Ago

Why do I care about open science

- 4th year PhD student in Neuroscience
- I've been interested in science from a young age

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Jennifer Stiso

[@stiso_jennifer](https://twitter.com/stiso_jennifer)

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Me, doing science (2 years old)

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Why do I care about open science

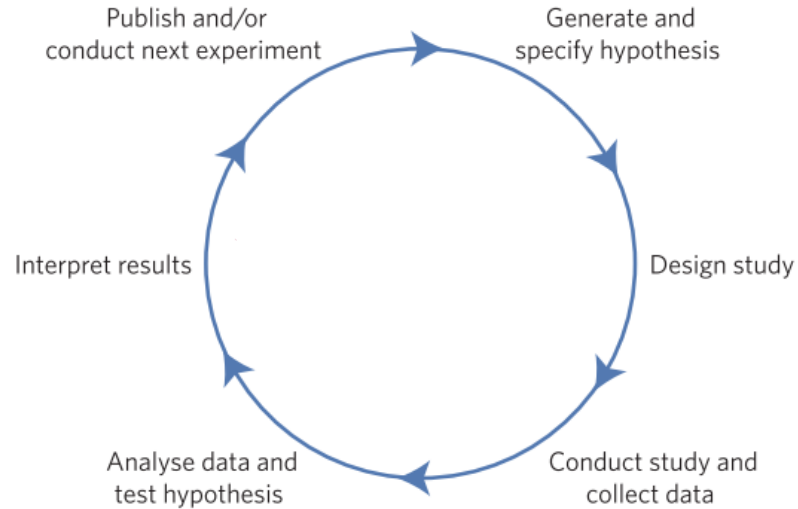
Me, doing science (2 years old)

- 4th year PhD student in Neuroscience
- I've been interested in science from a young age
- The process of discovery in science relies on “self-correction”
 - Without this self-correction, it is difficult to trust science as an institution



Why we need to make an effort to make science more open

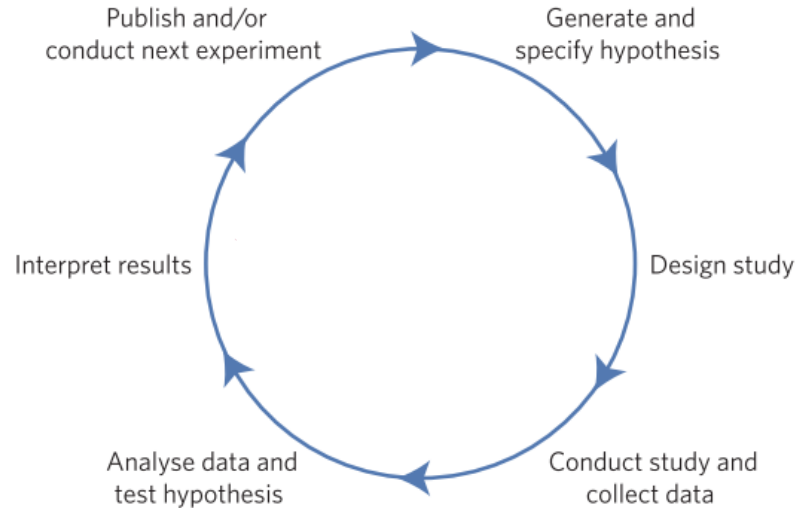
Self correcting?



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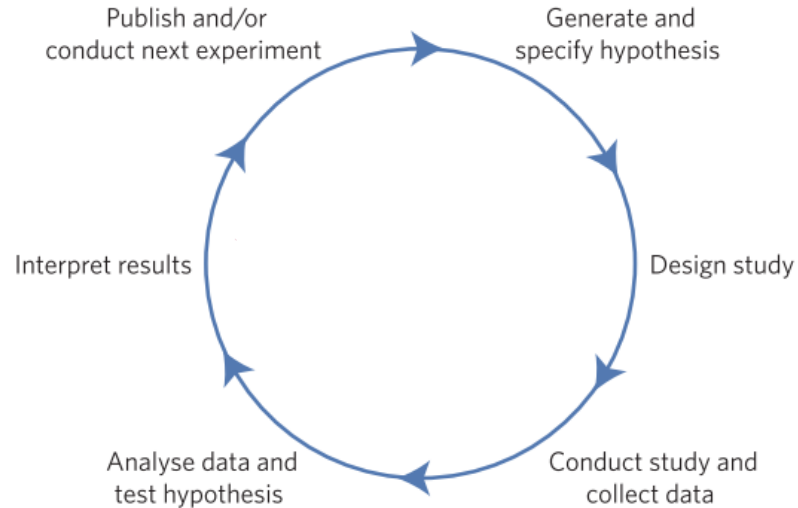
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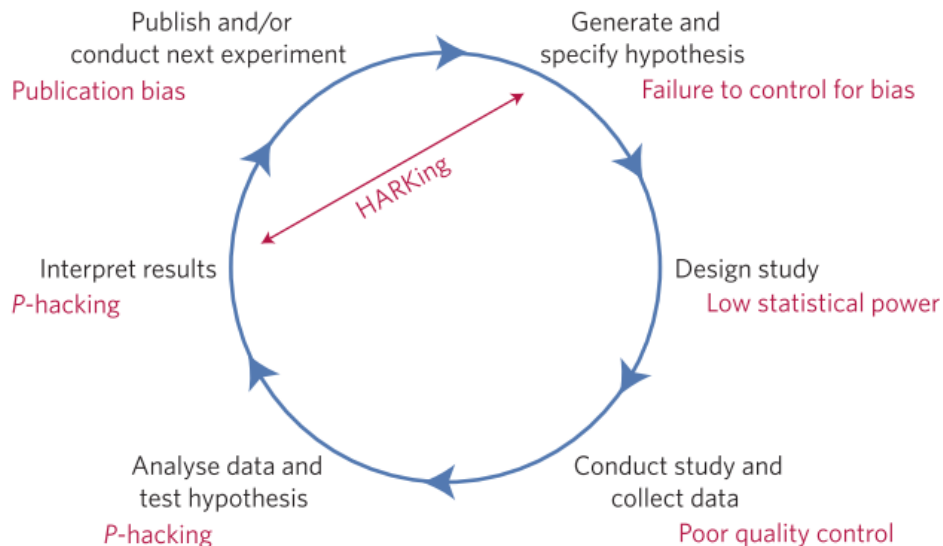
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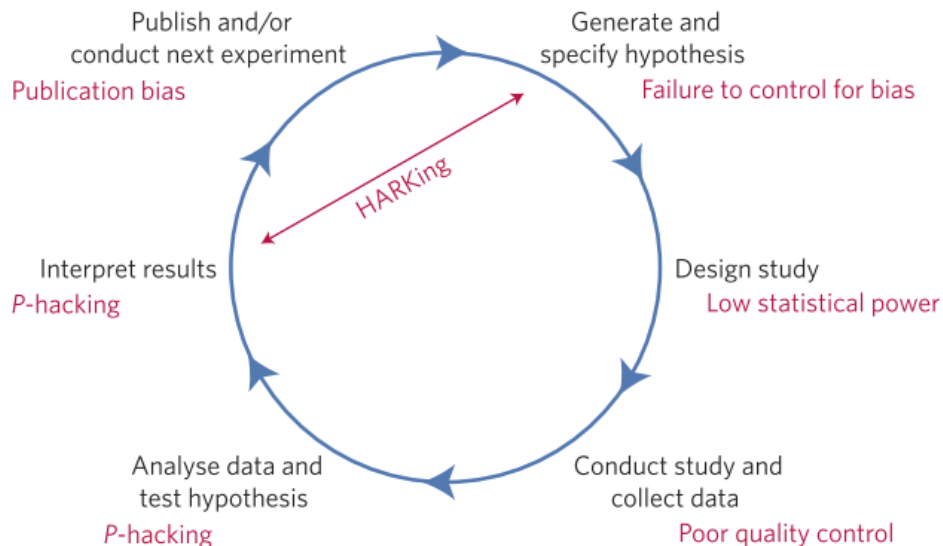
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- This can (partially) be explained by common practices (Manufo et. al (2017). *Nat Hum Beh*)
- Ultimately this erodes trust in science, and makes progress slower



What is open science?

Potential solutions to these problems now fit under a big umbrella called “open science”

Jennifer Stiso

 @stiso_jennifer

<https://www.talyarkoni.org/blog/2019/07/13/i-hate-open-science/>

What is open science?

Potential solutions to these problems now fit under a big umbrella called “open science”

- Reproducibility (reporting clarity, appropriate statistics)
- Accessibility (preprints, open access journals)
- Incentive Alignment (publishing null results)
- Diversity (outreach)
- Metascience (reporting clarity)

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How can I be a responsible scientist and make my research as reproducible as possible, given that I am not in full control over incentive structures, and have minimal training in open science practices (statistics, sharing code, etc)?

What is open science?



Tal Yarkoni
@talyarkoni



Replying to @talyarkoni @siminevazire

personally I think it's critical to unbundle open science. it isn't an all-or-nothing proposition. there are things everyone can do right now that have almost no downside (e.g., preprints), and others that potentially still have costs (e.g., sharing one's code).

♡ 9 1:36 PM - May 7, 2018



 See Tal Yarkoni's other Tweets



What is open science?

This unbundling is especially important for trainees, who might not have full control over the policies of their PI



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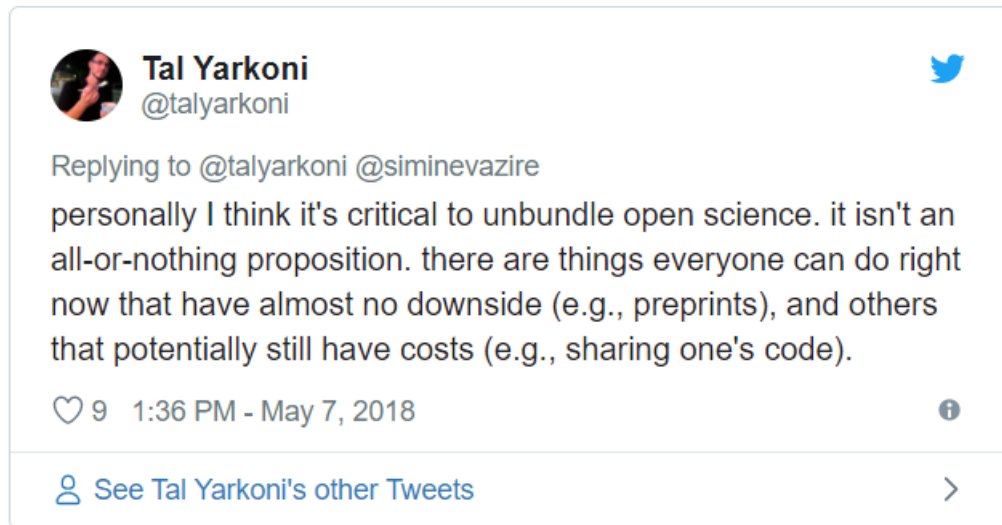
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1. Reporting clarity
2. Statistics
3. Accessibility

(References and resources for all this and more at the end)



Reporting Clarity

Jennifer Stiso

 @stiso_jennifer

Clear reporting facilitates replication and evaluation

ECoG

All ECoG data were first resampled to 1000 Hz, low-pass filtered at 180 Hz, high-pass filtered at 0.5 Hz, and notch-filtered at 60 Hz and its harmonics. ECoG data were then examined by a

Clear reporting facilitates replication and evaluation

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LFP Filtering

Hippocampal LFP traces were band-pass filtered in the θ band (4–10 Hz) using digital filters constructed via the Parks-McClellan optimal equiripple FIR filter design. Transition bands were 4 Hz–4.5 Hz and 10 Hz–10.5 Hz. Maximal ripple was 0.05 in the stop bands and 0.01 in the pass band. In order to faithfully preserve the theta

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1. People can't replicate or use techniques from your work
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In other words, it makes self correction difficult.

Resources for writing a complete methods section

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Reporting guidelines for main study types

Randomised trials	CONSORT	Extensions
Observational studies	STROBE	Extensions
Systematic reviews	PRISMA	Extensions
Study protocols	SPIRIT	PRISMA-P
Diagnostic/prognostic studies	STARD	TRIPOD
Case reports	CARE	Extensions
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 3. There are many bureaucratic parts of science, but following methods guidelines is actually important



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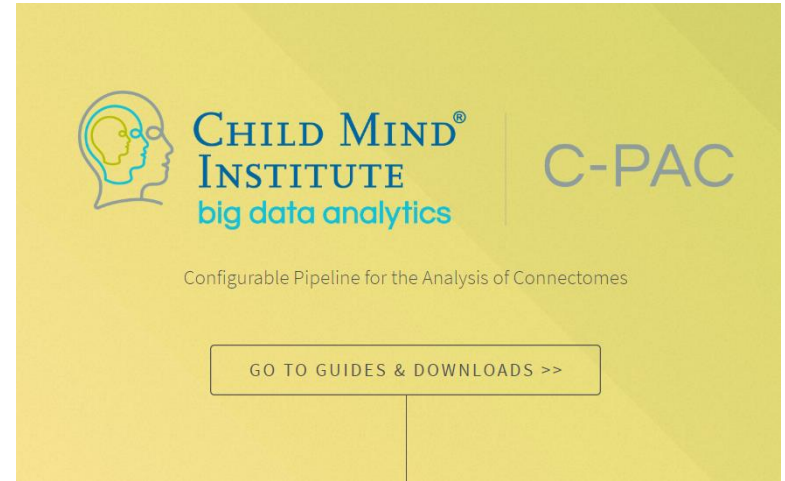
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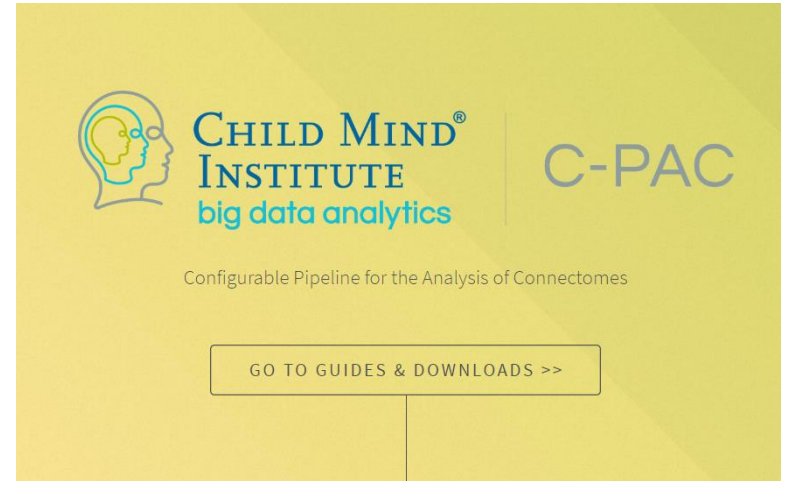
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 3. Try to have your second author reproduce key code or assays from just your methods section



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Meta-analyses are becoming and increasingly popular and fruitful way to synthesize research from many smaller studies. Meta-analyses rely on full reporting in primary research

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1. Take advantage of methods guidelines before writing the paper. Meta-analyses are becoming more popular and fruitful in these domains. However, even minimum recommendations of sample descriptives are frequently not adhered to. Over the last three volumes of *Psychophysiology*, there have been 356 empirical studies published. In the overwhelming majority of cases, information on participant sex was reported (only 22 [$<1\%$] failed to report the sex of participants). This is in sharp contrast to the 60 (14.5%) that reported racial information about the participants. Furthermore, only 18 studies (.05%) made any statement that addressed SES at all (either education level or income), and in most cases this fell short of clearly quantified information (e.g., “mostly higher SES”).
 1. See list from [this link](#)
2. Make sure a national or discipline-specific methodology manual is used. Some software reports (C-PAS) can be helpful.
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3. Report metrics that could be helpful

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Statistics

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 @stiso_jennifer

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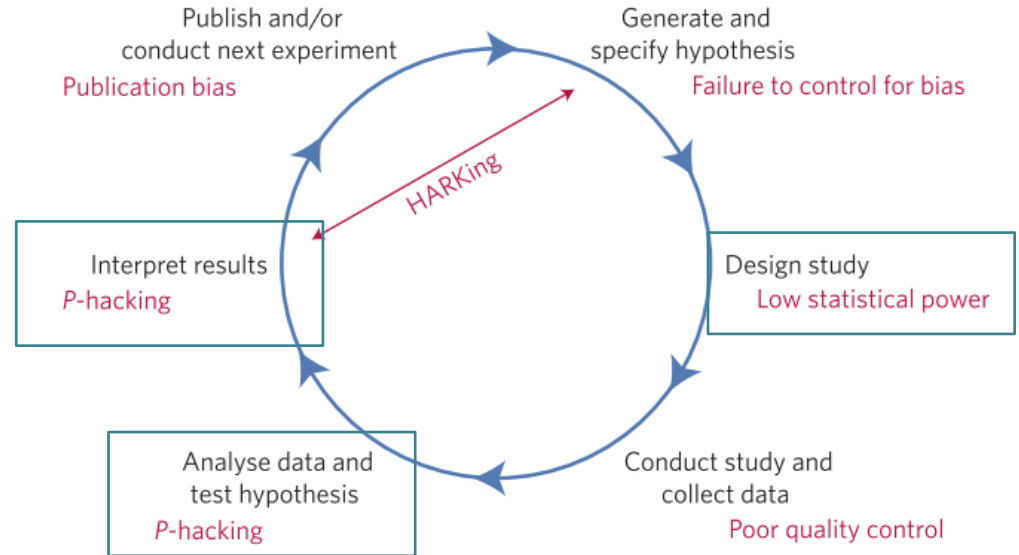
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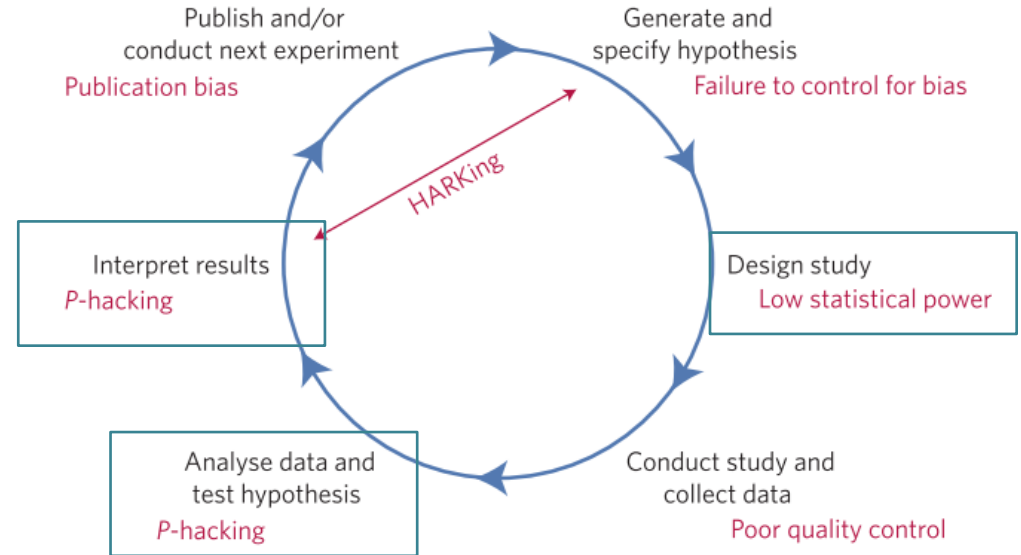


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As a result, using incorrect statistical tests, or improperly interpreting the results of statistical tests can lead to results the do not replicate.

This decreases trust in science, and slows discovery.



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Science Forum: Ten common statistical mistakes to watch out for when writing or reviewing a manuscript



Tamar R Makin [✉], Jean-Jacques Orban de Xivry
University College London, United Kingdom; KU Leuven, Belgium

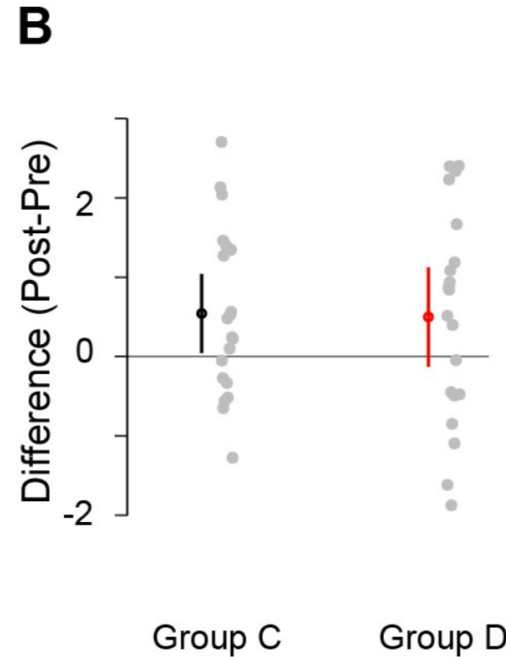
FEATURE ARTICLE Oct 9, 2019

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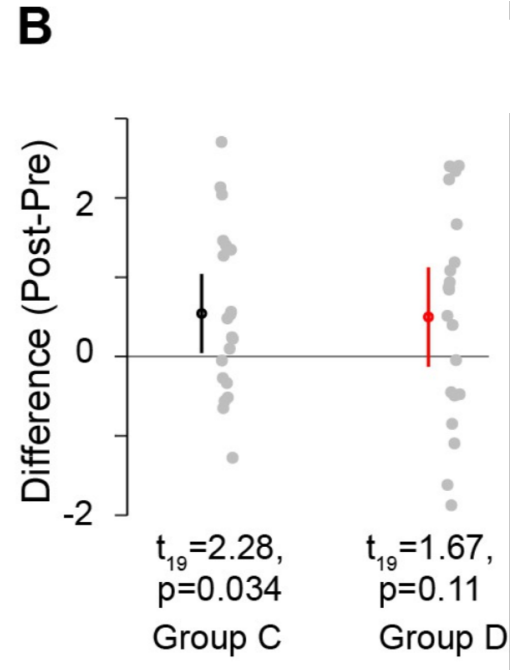
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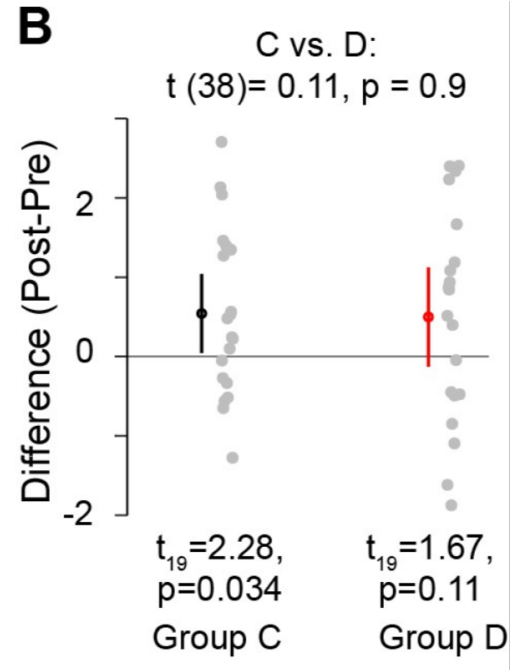
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 4. No, we need to directly compare the two group with and ANOVA or non-parametric test ([Leys and Schumann, 2010](#))

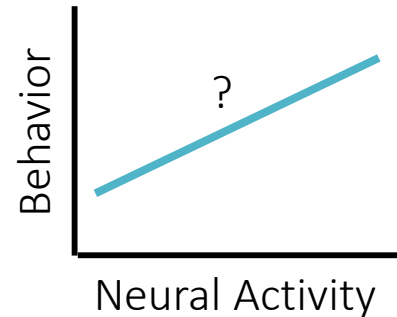
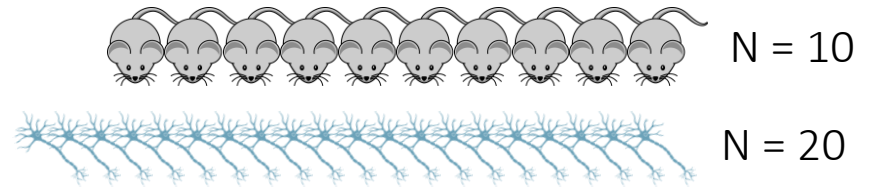


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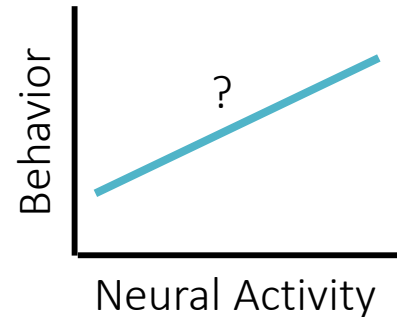
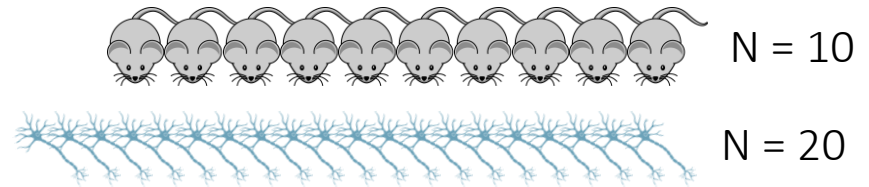
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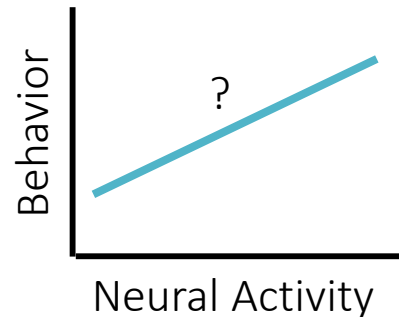
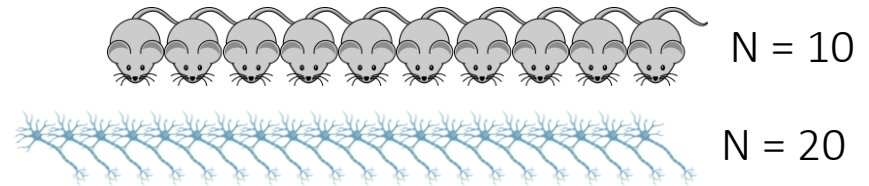
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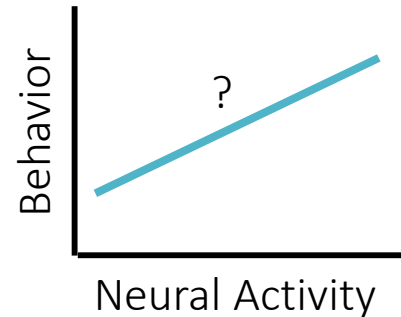
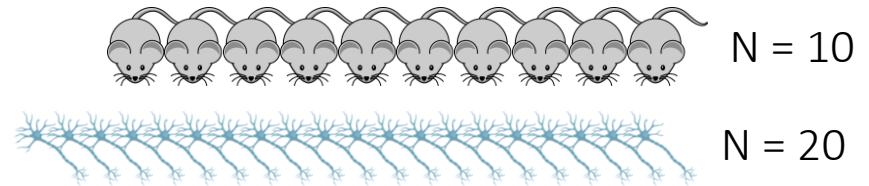
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N = 10	N = 20
df =	df =
Critical R =	Critical R =

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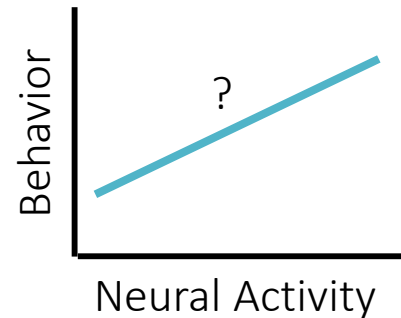
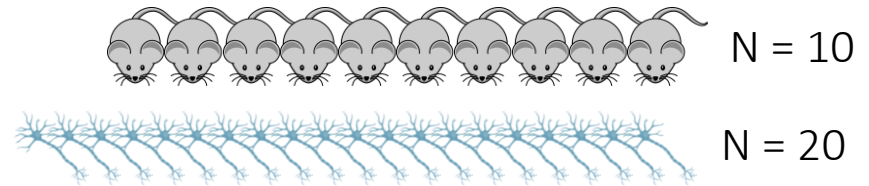
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$N = 10$	$N = 20$
$df = 8$	$df = 18$
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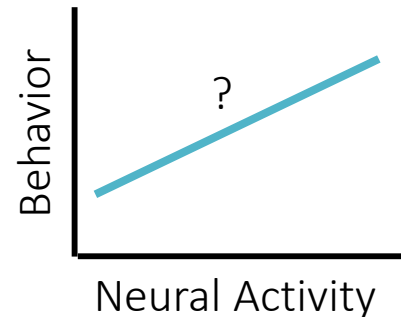
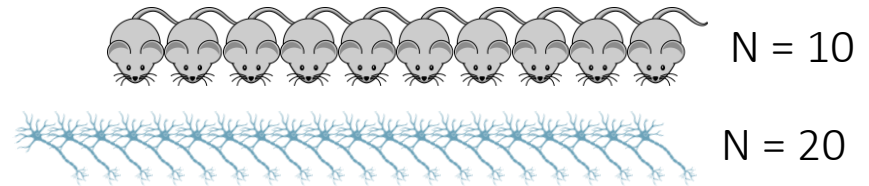
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 3. This should be tested using linear-mixed effects models, or by summarizing across neurons



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4. Fully report whatever tests you use so people can evaluate your choices (standardized effect sizes, p -values, confidence intervals, number of samples)

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Accessibility and Outreach

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 @stiso_jennifer

Places to share your science

Increased accessibility is good for science

It facilitate collaborations, diverse feedback, and advancement

Diversity is beneficial for collaborative teams (not just science)



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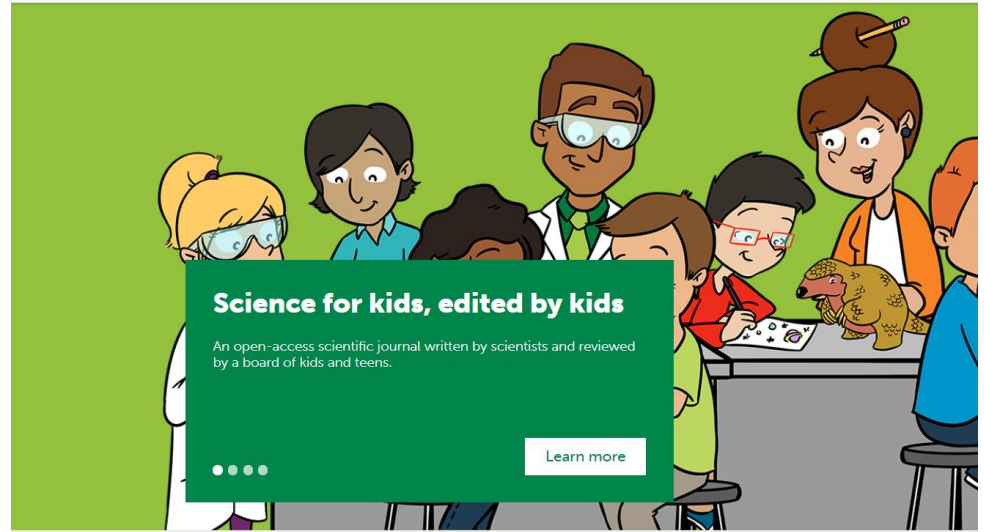
Preprints are freely available full manuscripts that have not yet been subject to peer review. Posting a preprint will give you credit for the project, give scientists a platform to give you feedback

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1. Preprints: make your science accessible to researchers everywhere
 1. arXiv, bioarXiv, psyarXiv, etc.
2. [Frontiers for Young Minds](#): write a review of your works and have it reviewed by kids

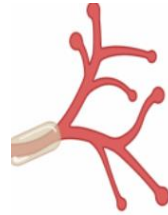


Articles Collections



Places to share your science

1. Preprints: make your science accessible to researchers everywhere
 1. arXiv, bioarXiv, psyarXiv, etc.
2. [Frontiers for Young Minds](#): write a review of your works and have it reviewed by kids
3. Blogging
 1. [PennNeuroKnow](#), [Brains in Briefs](#), [The Conversation](#)



PennNeuroKnow

Breaking down the brain for everyone to understand



Penn has some science communication opportunities, including PennNeuroKnow, where you summarize a topic in science,

Places to share your science

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JULY 27, 2018 · NEURODEGENERATION, ALS

THERE'S A NEW JANITOR IN TOWN: CLEANING UP THE MESS IN ALS

or, technically,

Optineurin is an autophagy receptor for damaged mitochondria in parkin-mediated mitophagy that is disrupted by an ALS-linked mutation [See the original abstract on PubMed]

Penn has some science communication opportunities, including *PennNeuroKnow*, where you summarize a topic in science, or *Brains in Briefs*, where you write a lay summary of a specific paper

Places to share your science

1. Preprints: make your science accessible to researchers everywhere
 1. arXiv, bioarXiv, psyarXiv, etc.
2. [Frontiers for Young Minds](#): write a review of your works and have it reviewed by kids
3. Blogging
 1. [PennNeuroKnow](#), [Brains in Briefs](#), [The Conversation](#)



Outside of Penn, you can submit write-ups of your work to publishers like *The Conversation*, that publish accessible scientific articles written by researchers themselves

Conclusion

Scientists at every level can find ways to make their science easier for the scientific community to use responsibly, and more accessible to everyone

Specifically, everyone can:

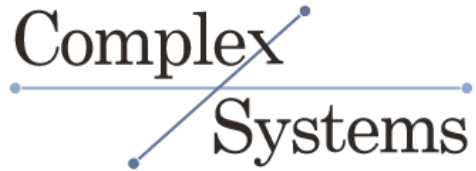
1. Accurately report their science
2. Make inferences that are appropriate to the statistics used
3. Share your science

(For resources about registered reports, github best practices, see extra slides)

Thanks!

Slides (with resources will be on my website! <http://www.jenniferstiso.com/talks/>)

Bassett Lab Slack Channel



Dani Bassett



Tim Lucas



Ursula Tooley (@UTooley)



Other people on Twitter:
@siminevazire (Simine Vazire)
@tal_yarkoni (Tal Yarkoni)
@kirstie_j (Kirstie Whitaker)
@BrianNosek (Brian Nosek)
@hardsci (Sanjay Srivastava)

References and Resources

Replication Crisis

- <https://www.nature.com/news/over-half-of-psychology-studies-fail-reproducibility-test-1.18248>
- Camerer, C. F. *et al.* Evaluating the replicability of social science experiments in Nature and Science between 2010 and 2015. *Nat. Hum. Behav.* **2**, 637–644 (2018).
- Open Science Collaboration. (2015). [Estimating the reproducibility of psychological science](#). *Science*, 349(6251), aac4716. Doi: 10.1126/science.aac4716
- Nosek, B. A. & Errington, T. M. Making sense of replications. *Elife* **6**, 4–7 (2017).

Intro to Open Science

- Spellman, B. A., Gilbert, E. A. & Corker, K. S. Open Science : What, Why, and How. *PsyArXiv* (2017).
- Gilmore, R. O., Diaz, M. T., Wyble, B. A. & Yarkoni, T. Progress toward openness, transparency, and reproducibility in cognitive neuroscience. *Ann. N. Y. Acad. Sci.* 5–18 (2017). doi:10.1111/nyas.13325
- Munafò, M. R. *et al.* A manifesto for reproducible science. *Nat. Hum. Behav.* **1**, 1–9 (2017).
- talyarkoni.org/blog/2019/07/13/i-hate-open-science/

General Resources and Best Practices

- Software carpentry (free classes and workshops): <https://software-carpentry.org/about/>
- Research software experts: <https://researchsoftware.org/>
- This Twitter thread asking for resources: <https://twitter.com/andreaarnham/status/1184456096322334720>
- Miriam Alys resources for organizing research: <https://osf.io/mdh87/wiki/Coding%2C%20fMRI%2C%20and%20Stats%20Help/>

References and Resources

Preregistration and Preprints

- <https://journals.sagepub.com/doi/full/10.1177/1475725719875844>
- Twitter thread on why pre-prints are useful:
https://twitter.com/dsquintana/status/962214636312461312?ref_src=twsrc%5Etfw%7Ctwcamp%5Etweetembed%7Ctwterm%5E962214636312461312&ref_url=https%3A%2F%2Fwww.aje.com%2Farc%2Fbenefits-of-preprints-for-researchers%2F

Statistics

- Friston, K. NeuroImage Ten ironic rules for non-statistical reviewers Author 's personal copy. **61**, 1300–1310 (2012).
- Makin, et. al *eLife* (2019).
- Andy fields statistics hell <https://www.discoveringstatistics.com/statistics-hell-p/>
- Russ Poldrack's statistics textbook: <http://statstinking21.org/>, and <https://github.com/poldrack/psych10-book>

Methods Templates

- Transparency and Openness Promotion <https://cos.io/top/>
- Consolidated Standards of Reporting Trials: <http://www.consort-statement.org/>
- Making Methods Clearer (2013). *Nat Neurosci*
- List of more methods templates: <http://www.equator-network.org>

References and Resources

Social Media

- Social media for scientists. *Nat. Cell Biol.* **20**, 1329 (2018).
- How to use twitter for science: <https://hub.jhu.edu/2017/01/19/reading-tweeting-science-intersession/>

GitHub

- Git introduction: <http://swcarpentry.github.io/git-novice/>
- .gitignore templates <https://github.com/github/gitignore>
- Good examples of git repos: <https://github.com/ContextLab/timecorr-paper>
- Structuring a repository for a python module: <https://docs.python-guide.org/writing/structure/#modules>

R Markdown

- Recommendations for organizing projects with r markdown: <https://cran.r-project.org/web/packages/summarytools/vignettes/Recommendations-rmarkdown.html>
- Example from Julia Leonard: <https://osf.io/2bkdy/>