

# The Reproducibility Crisis in science and how to solve it

Zoltan Dienes  
University of Sussex

1. Evidence that there is a problem

2. Solutions!

1. The problem.

**Psychological Bulletin**  
1979, Vol. 86, No. 3, 638-641

# The “File Drawer Problem” and Tolerance for Null Results

Robert Rosenthal  
Harvard University

For any given research area, one cannot tell how many studies have been conducted but never reported. The extreme view of the “file drawer problem” is that 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. Quantitative procedures for computing the tolerance for filed and future null results are reported and illustrated, and the implications are discussed.

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

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DOI: 10.1177/0956797611417632  
<http://pss.sagepub.com>  


**Joseph P. Simmons<sup>1</sup>, Leif D. Nelson<sup>2</sup>, and Uri Simonsohn<sup>1</sup>**

<sup>1</sup>The Wharton School, University of Pennsylvania, and <sup>2</sup>Haas School of Business, University of California, Berkeley

## Abstract

In this article, we accomplish two things. First, we show that despite empirical psychologists' nominal endorsement of a low rate of false-positive findings ( $\leq .05$ ), flexibility in data collection, analysis, and reporting dramatically increases actual false-positive rates. In many cases, a researcher is more likely to falsely find evidence that an effect exists than to correctly find evidence that it does not. We present computer simulations and a pair of actual experiments that demonstrate how unacceptably easy it is to accumulate (and report) statistically significant evidence for a false hypothesis. Second, we suggest a simple, low-cost, and straightforwardly effective disclosure-based solution to this problem. The solution involves six concrete requirements for authors and four guidelines for reviewers, all of which impose a minimal burden on the publication process.

**Table 1.** Likelihood of Obtaining a False-Positive Result

Researcher degrees of freedom	Significance level		
	$p < .1$	$p < .05$	$p < .01$
Situation A: two dependent variables ( $r = .50$ )	17.8%	9.5%	2.2%
Situation B: addition of 10 more observations per cell	14.5%	7.7%	1.6%
Situation C: controlling for gender or interaction of gender with treatment	21.6%	11.7%	2.7%
Situation D: dropping (or not dropping) one of three conditions	23.2%	12.6%	2.8%
Combine Situations A and B	26.0%	14.4%	3.3%
Combine Situations A, B, and C	50.9%	30.9%	8.4%
Combine Situations A, B, C, and D	81.5%	60.7%	21.5%

# Measuring the Prevalence of Questionable Research Practices With Incentives for Truth Telling

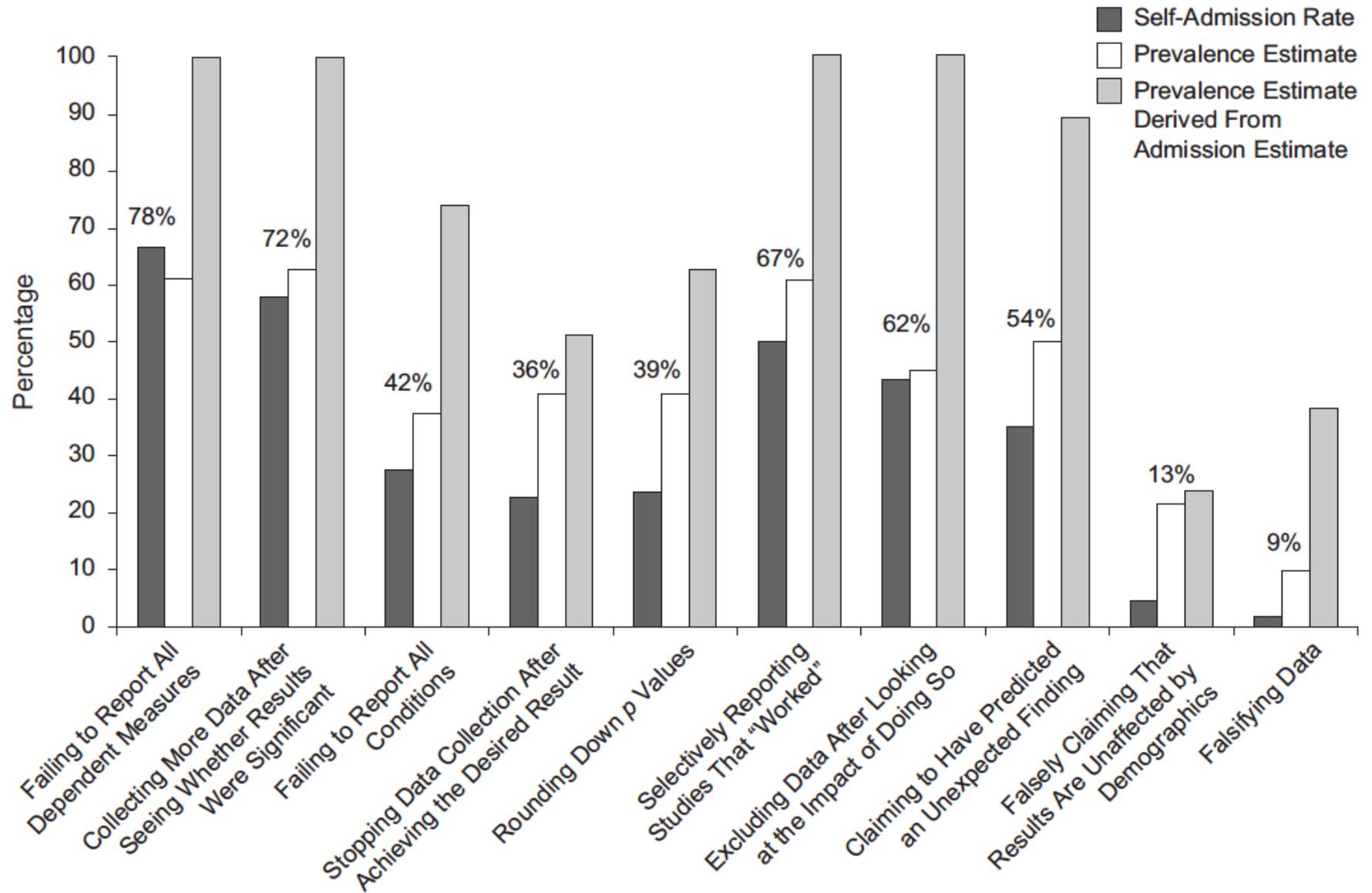
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DOI: 10.1177/0956797611430953  
<http://pss.sagepub.com>  


**Leslie K. John<sup>1</sup>, George Loewenstein<sup>2</sup>, and Drazen Prelec<sup>3</sup>**

<sup>1</sup>Marketing Unit, Harvard Business School; <sup>2</sup>Department of Social & Decision Sciences, Carnegie Mellon University; and <sup>3</sup>Sloan School of Management and Departments of Economics and Brain & Cognitive Sciences, Massachusetts Institute of Technology

## Abstract

Cases of clear scientific misconduct have received significant media attention recently, but less flagrantly questionable research practices may be more prevalent and, ultimately, more damaging to the academic enterprise. Using an anonymous elicitation format supplemented by incentives for honest reporting, we surveyed over 2,000 psychologists about their involvement in questionable research practices. The impact of truth-telling incentives on self-admissions of questionable research practices was positive, and this impact was greater for practices that respondents judged to be less defensible. Combining three different estimation methods, we found that the percentage of respondents who have engaged in questionable practices was surprisingly high. This finding suggests that some questionable practices may constitute the prevailing research norm.



**Fig. 1.** Results of the Bayesian-truth-serum condition in the main study. For each of the 10 items, the graph shows the self-admission rate, prevalence estimate, prevalence estimate derived from the admission estimate (i.e., self-admission rate/admission estimate), and geometric mean of these three percentages (numbers above the bars). See Table 1 for the complete text of the items.

# A peculiar prevalence of $p$ values just below .05

E. J. Masicampo<sup>1</sup>, and Daniel R. Lalande<sup>2</sup>

<sup>1</sup>Department of Psychology, Wake Forest University, Winston-Salem, NC, USA

<sup>2</sup>Department of Health Sciences, Université du Québec à Chicoutimi, Chicoutimi, QC, Canada

In null hypothesis significance testing (NHST),  $p$  values are judged relative to an arbitrary threshold for significance (.05). The present work examined whether that standard influences the distribution of  $p$  values reported in the psychology literature. We examined a large subset of papers from three highly regarded journals. Distributions of  $p$  were found to be similar across the different journals. Moreover,  $p$  values were much more common immediately below .05 than would be expected based on the number of  $p$  values occurring in other ranges. This prevalence of  $p$  values just below the arbitrary criterion for significance was observed in all three journals. We discuss potential sources of this pattern, including publication bias and researcher degrees of freedom.



# The behavioural priming saga ...

Replication

## Does Cleanliness Influence Moral Judgments?

A Direct Replication of Schnall, Benton, and Harvey (2008)

David J. Johnson, Felix Cheung, and M. Brent Donnellan  
Department of Psychology, Michigan State University, East Lansing, MI, USA

**Abstract.** Schnall, Benton, and Harvey (2008) hypothesized that physical cleanliness reduces the severity of moral judgments. In support of this hypothesis (Exp. 1) and when they were supplied by the original materials (Exp. 2), the original study provided over .99 correlation from Experiment 1 (original  $d = -0.85$ , 95% population effect sizes are small and morality should

Replication

## Replication of “Experiencing Physical Warmth Promotes Interpersonal Warmth” by Williams and Bargh (2008)

Dermot Lynott,<sup>1</sup> Katherine S. Coker,<sup>2</sup> Jessica Wortman,<sup>3</sup> Louise Connell,<sup>1</sup> M. Brent Donnellan,<sup>3</sup> Richard E. Lucas,<sup>3</sup> and Kerry O'Brien<sup>4,5</sup>

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PLOS ONE

## Priming of Social Distance? Failure to Replicate Effects on Social and Food Judgments

Harold Pashler<sup>1,2</sup>, Noriko Coburn, Christine R. Harris

University of California San Diego, La Jolla, California, United States of America

### Abstract

Williams and Bargh (2008) reported an experiment in which participants were simply asked to plot a single pair of points on a piece of graph paper, with the coordinates provided by the experimenter specifying a pair of points that lay at one of three different distances (close, intermediate, or far, relative to the range available on the graph paper). The participants who had graphed a more distant pair reported themselves as being significantly less close to members of their own family than did those who had plotted a more closely-situated pair. In another experiment, people's estimates of the caloric content of different foods were reportedly altered by the same type of spatial distance priming. Direct replications of both results were attempted, with precautions to ensure that the experimenter did not know what condition the participant was assigned to. The results showed no hint of the priming effects reported by Williams and Bargh (2008).

**Citation:** Pashler H, Coburn N, Harris CR (2012) Priming of Social Distance? Failure to Replicate Effects on Social and Food Judgments. PLoS ONE 7(8): e42510. doi:10.1371/journal.pone.0042510

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**Copyright:** © 2012 Pashler et al. This is an open-access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

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**Competing Interests:** The authors have declared that no competing interests exist.

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RESEARCH ARTICLE

### Priming Intelligent Behavior: An Elusive Phenomenon

David R. Shanks<sup>1</sup>, Ben R. Newell, Eun Hee Lee, Divya Balakrishnan, Lisa Ekelund, Zarus Cenac, Fr...

Published: April 24, 2013 • DOI: 10.1371/journal.pone.0056615

Article About the Authors Metrics Comments

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PLOS ONE

## Two Failures to Replicate High-Performance-Goal Priming Effects

Christine R. Harris<sup>1</sup>, Noriko Coburn<sup>1</sup>, Doug Rohrer<sup>2</sup>, Harold Pashler<sup>1</sup>

<sup>1</sup> Psychology Department, University of California San Diego, La Jolla, California, United States of America, <sup>2</sup> Psychology Department, University of South Florida, Tampa, Florida, United States of America

### Abstract

Rohrer et al. (2011) reported two experiments in which people were exposed to words related to achievement (e.g., "winning") and then performed a task. In both experiments, the priming words had no effect on performance.

Journal of Experimental Social Psychology 49 (2013) 959–964

Contents lists available at SciVerse ScienceDirect

Journal of Experimental Social Psychology

journal homepage: www.elsevier.com/locate/jesp



### Can the goal of honesty be primed?

Harold Pashler<sup>1,2</sup>, Doug Rohrer<sup>1</sup>, Christine R. Harris<sup>1</sup>

<sup>1</sup> University of California, San Diego, USA  
<sup>2</sup> University of South Florida, USA



### HIGHLIGHTS

- We attempted to replicate the “Honesty Priming” effect of Rasinski et al. (2005).
- Two direct replications failed to reproduce the effect.
- An additional conceptual replication using a broader outcome measure also failed.

### ARTICLE INFO

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### Keywords:

Honesty  
Candor  
Social desirability  
Priming  
Social priming

### ABSTRACT

In a simple study involving 64 participants, Rasinski, Visser, Zapatsky, and Rickett (2005) reported that requiring people to make semantic judgments involving four words related to honesty (embedded among other words) increased the likelihood that they would later admit to having engaged in problematic alcohol-related behaviors (e.g., drinking to the point of blackout). If valid, this honesty-priming effect would offer a powerful intervention to improve the validity of self-report data in many different contexts. To determine whether the effect is replicable, we first attempted two replications using the same materials, tasks, and measures used by Rasinski et al. Experiment 1 repeated the study with a sample of 150 students. No priming effects were observed here, nor in a follow-up study using adults recruited on the web (Experiment 2). Experiment 3 used the same priming manipulation together with a more refined measure of response candor (derived from Paulhus, 1991). Again, the honesty-related primes had no detectable effects.

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## **Reproducibility Project** (Open Science Collaboration, 2015)

97 studies taken from 2008 volume of *Journal of Personality and Social Psychology*, *Psychological Science*, and *Journal of Experimental Psychology: Learning, Memory, and Cognition*.

Exact replications attempted by academic crowd sourcing.

What proportion of replications will be significant, given average power 92%?

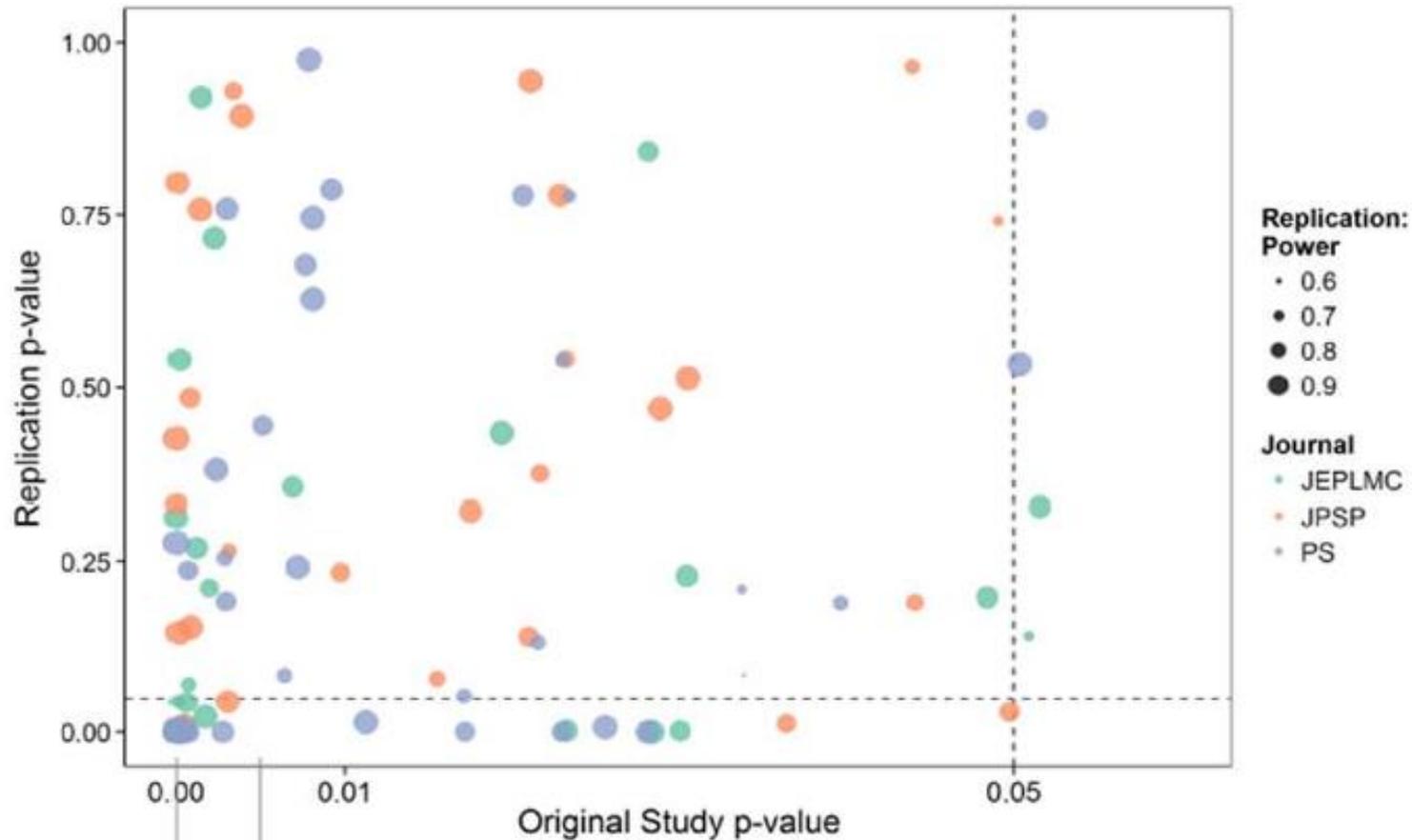
0%

100%

What proportion of replications will be significant, given power 92%?

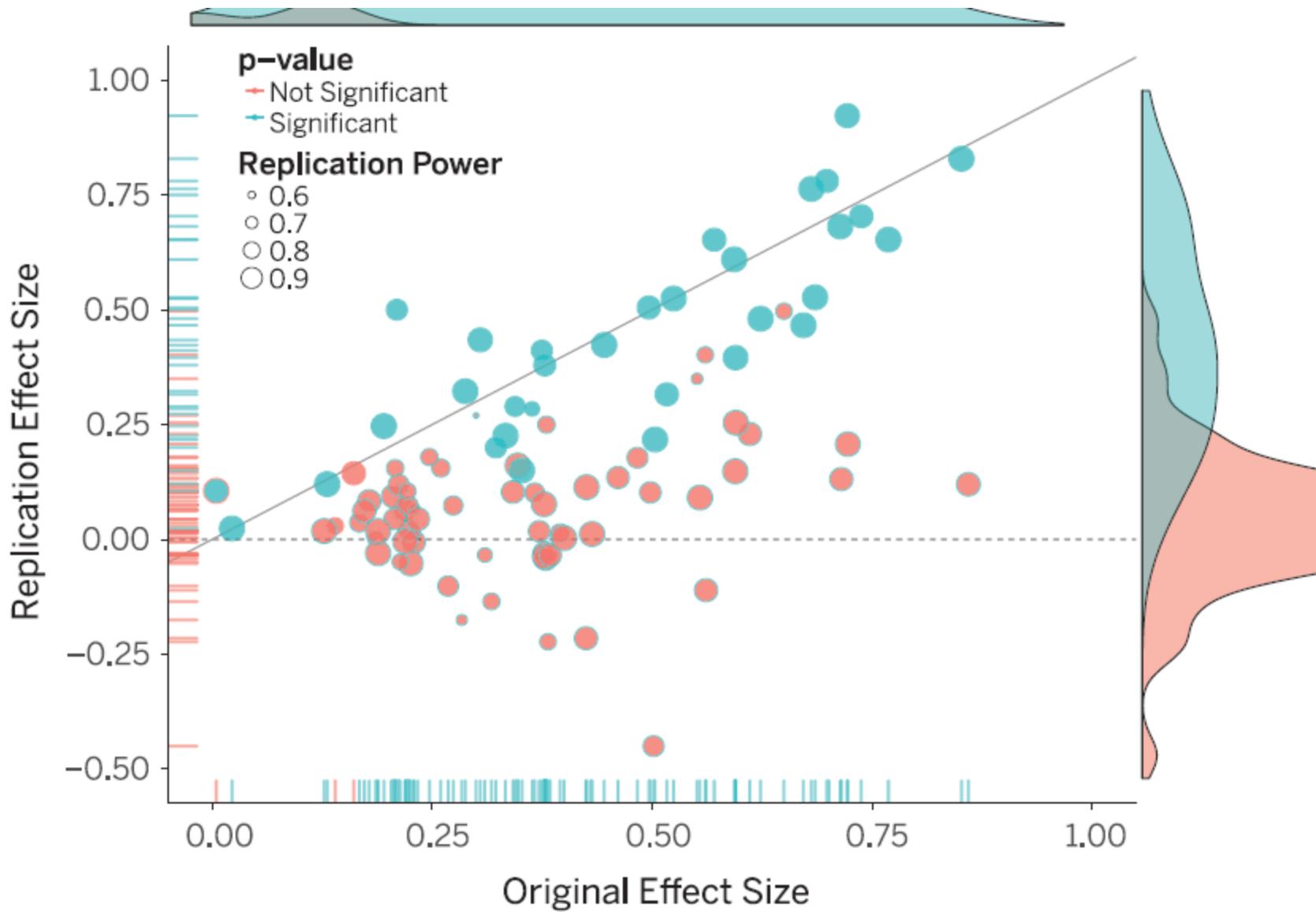


35/97 replications significant, i.e. 36%



Social 14/55 (25%)

Cognitive 21/42 (50%)



What can be done?

i. Pre-registration (<https://osf.io/8mpji/wiki/home/> )

Change incentives to get quality of science right independent of results.

(*Cortex* ...and about 20 other journals now)

ii. Publication of direct replications in prestige journals

iii. Transparency: Full online easy public availability of materials, programs, raw data, analyses scripts. (Cf. Open Science Framework: <https://osf.io/> )

iv. Statistical reform

v. Institutional reform

What can be done?

i.Pre-registration

Why pre-registration?

# Science has an incentive problem

**What's best for  
science**

Transparent and high  
quality research,  
regardless of outcome

**What's best for  
scientists**

Producing a lot of  
“good results”

Because we place too much importance on the **results** of experiments and not enough on the **processes** that produce them

Results make science exciting but judging the quality of science (and scientists) according to the results condemns us to being a “soft” science

# Can we fix this? Yes

## **Philosophy:**

What gives hypothesis-testing its scientific value is:

- the QUESTION it asks
- the QUALITY of the method it uses
- not the RESULT it produces

If we accept this philosophy then editorial decisions at journals should be *blind* to results

# Registered Reports

CORTEX 49 (2013) 609–610



Available online at [www.sciencedirect.com](http://www.sciencedirect.com)

**SciVerse ScienceDirect**

Journal homepage: [www.elsevier.com/locate/cortex](http://www.elsevier.com/locate/cortex)



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## Editorial

### **Registered Reports: A new publishing initiative at Cortex**

*Christopher D. Chambers*

*Cardiff University Brain Research Imaging Centre (CUBRIC), School of Psychology, Cardiff University, United Kingdom*

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## **Four central aspects of the Registered Reports model:**

- Researchers decide hypotheses, experimental procedures, and main analyses *before* data collection
- Part of the peer review process takes place before experiments are conducted
- Passing this stage of review virtually guarantees publication
- Original studies and high-value replications are welcome



Registered report

## The P600 as a correlate of ventral attention network reorientation

Jona Sassenhagen<sup>a</sup>,  , Ina Bornkessel-Schlesewsky<sup>b, a</sup>

 [Show more](#)

doi:10.1016/j.cortex.2014.12.019

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### Abstract

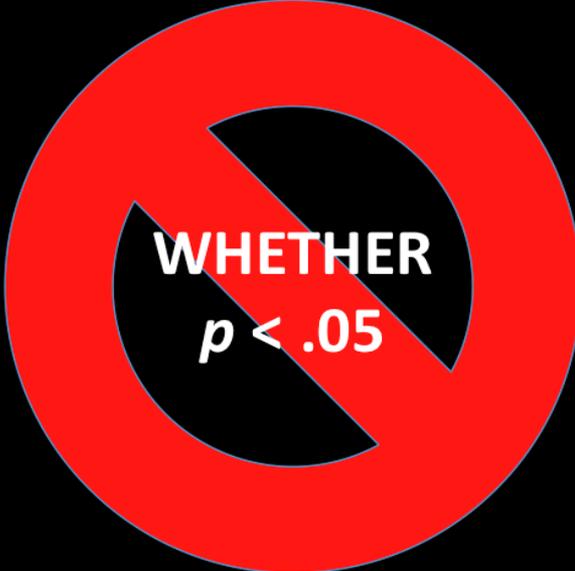
When, during language processing, a reader or listener is confronted with a structurally deviant phrase, this typically elicits a late positive ERP deflection (P600). The P600 is often understood as a correlate of structural analysis. This assumption has informed a number of neurocognitive models of language. However, the P600 strongly resembles the P3, likely a more general electrophysiological correlate of reorientation behaviour supported by noradrenergic input to the ventral attention network/VAN. Some researchers have proposed that the P600 is an instance of the P3, not a distinct component reflecting the analysis of structured inputs. Here, we tested the P600-as-P3 hypothesis by estimating the alignment of the P600 elicited in a visual sentence processing task to simultaneously collected behavioural measures. A similar analysis was undertaken for a P3 elicited in a separate non-linguistic (face detection) task. Since the P3 is usually aligned to reaction time/RT, the same should hold for the P600; a failure to find RT alignment of the P600 would pose a problem for the P600-as-P3 hypothesis. In contrast, RT alignment of the P600 would associate it with the well-established VAN/Locus Coeruleus – Noradrenaline – Network subserving cortical reorientation.

We failed to falsify the hypothesis of RT alignment. Secondary measures, while less unambiguous, were more in agreement with the P600-as-P3 hypothesis. We interpret our results as corroborating the hypothesis that the P600 is a P3, in that it shows that the P600 is RT-aligned. This perspective is

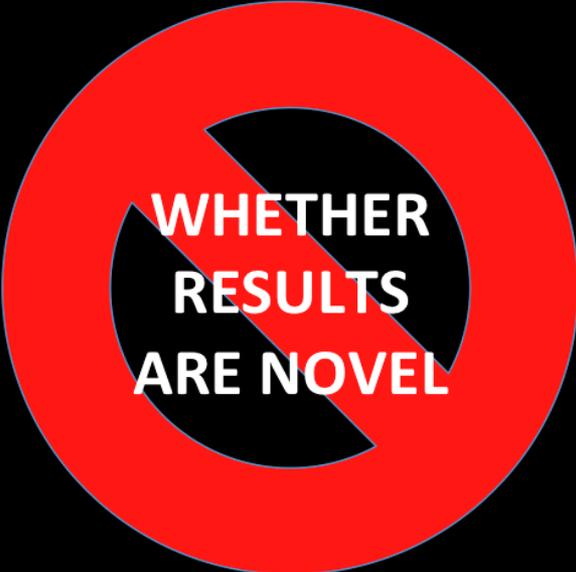
# None of these things matter

A red circle with a diagonal slash through it, indicating prohibition or negation.

**WHETHER  
HYPOTHESIS  
SUPPORTED**

A red circle with a diagonal slash through it, indicating prohibition or negation.

**WHETHER  
 $p < .05$**

A red circle with a diagonal slash through it, indicating prohibition or negation.

**WHETHER  
RESULTS  
ARE NOVEL**

A red circle with a diagonal slash through it, indicating prohibition or negation.

**WHETHER  
RESULTS  
HAVE  
"IMPACT"**

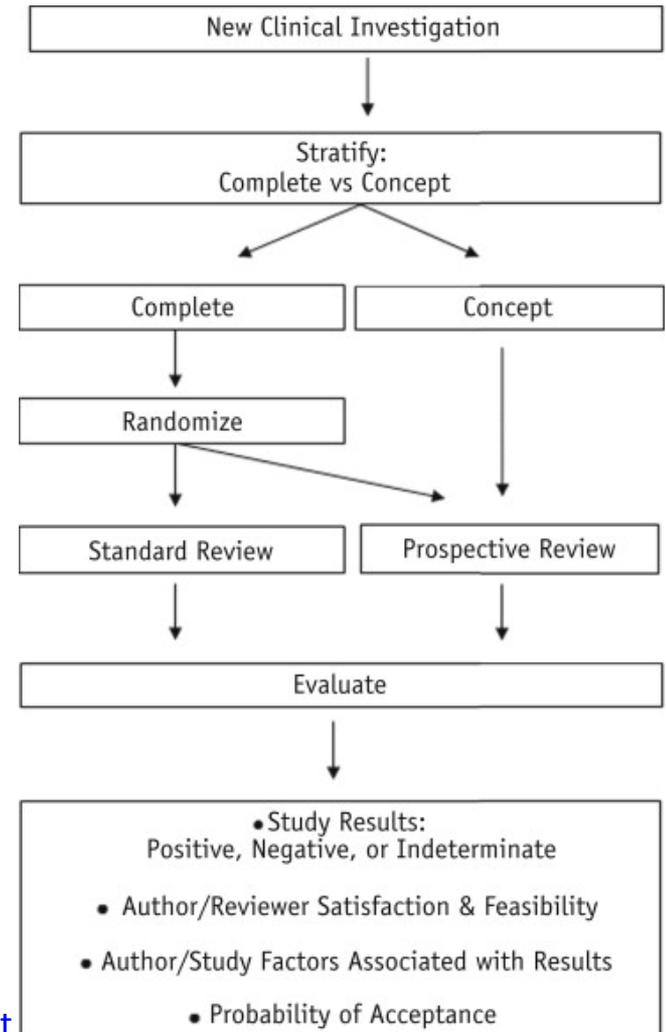
What is the evidence the pre-registration even works? Does it reduce publication bias or improve study quality?

- At least one journal has pre-registered a trial of Registered Reports

## Introducing Prospective Manuscript Review to Address Publication Bias

Loren K. Mell, MD,\* and Anthony L. Zietman, MD<sup>†</sup>

*\*Department of Radiation Medicine and Applied Sciences, University of California San Diego, La Jolla, California; and <sup>†</sup>Department of Radiation Oncology, Massachusetts General Hospital, Boston, Massachusetts*



Number of studies finding medical interventions effective before preregistration introduced:  
17/30 (55%)

Afterwards:

The image shows a screenshot of a PLOS ONE research article page. At the top, the PLOS ONE logo is on the left, and navigation links for 'Publish', 'About', and 'Browse' are on the right. Below the logo, there are icons for 'OPEN ACCESS' and 'PEER-REVIEWED'. The article title is 'Likelihood of Null Effects of Large NHLBI Clinical Trials Has Increased over Time', authored by Robert M. Kaplan and Veronica L. Irvin. The publication date is August 5, 2015, with a DOI of 10.1371/journal.pone.0132382. A navigation bar below the title has five tabs: 'Article' (highlighted in orange), 'Authors', 'Metrics', 'Comments', and 'Related Content'. On the left side, a vertical menu lists sections: 'Abstract', 'Introduction', 'Method', 'Results', 'Discussion', 'Supporting Information', and 'Acknowledgments'. The main content area displays the 'Abstract' section, which includes a 'Background' paragraph and the start of a 'Methods' section.

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RESEARCH ARTICLE

# Likelihood of Null Effects of Large NHLBI Clinical Trials Has Increased over Time

Robert M. Kaplan , Veronica L. Irvin

Published: August 5, 2015 • DOI: 10.1371/journal.pone.0132382

Article | Authors | Metrics | Comments | Related Content

**Abstract**

Introduction  
Method  
Results  
Discussion  
Supporting Information  
Acknowledgments

**Abstract**

**Background**

We explore whether the number of null results in large National Heart Lung, and Blood Institute (NHLBI) funded trials has increased over time.

**Methods**

We identified all large NHLBI supported RCTs between 1970 and 2012 evaluating drugs or

Number of studies finding medical interventions effective before preregistration introduced:  
17/30 (55%)

Afterwards:  
2/25 (8%)

# Likelihood of Null Effects of Large NHLBI Clinical Trials Has Increased over Time

Robert M. Kaplan , Veronica L. Irvin

Published: August 5, 2015 • DOI: 10.1371/journal.pone.0132382

<b>Article</b>	<b>Authors</b>	<b>Metrics</b>	<b>Comments</b>	<b>Related Content</b>
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- Abstract**
- Introduction
- Method
- Results
- Discussion
- Supporting Information
- Acknowledgments

## Abstract

### Background

We explore whether the number of null results in large National Heart Lung, and Blood Institute (NHLBI) funded trials has increased over time.

### Methods

We identified all large NHLBI supported RCTs between 1970 and 2012 evaluating drugs or

Variant:

Create a number of datasets by re-arranging labels, adding a bit of noise or offset etc.

Analyst does not know which is real data set.

Work out analysis protocol so that it is solid

Break blind - and bingo unbiased analyses!

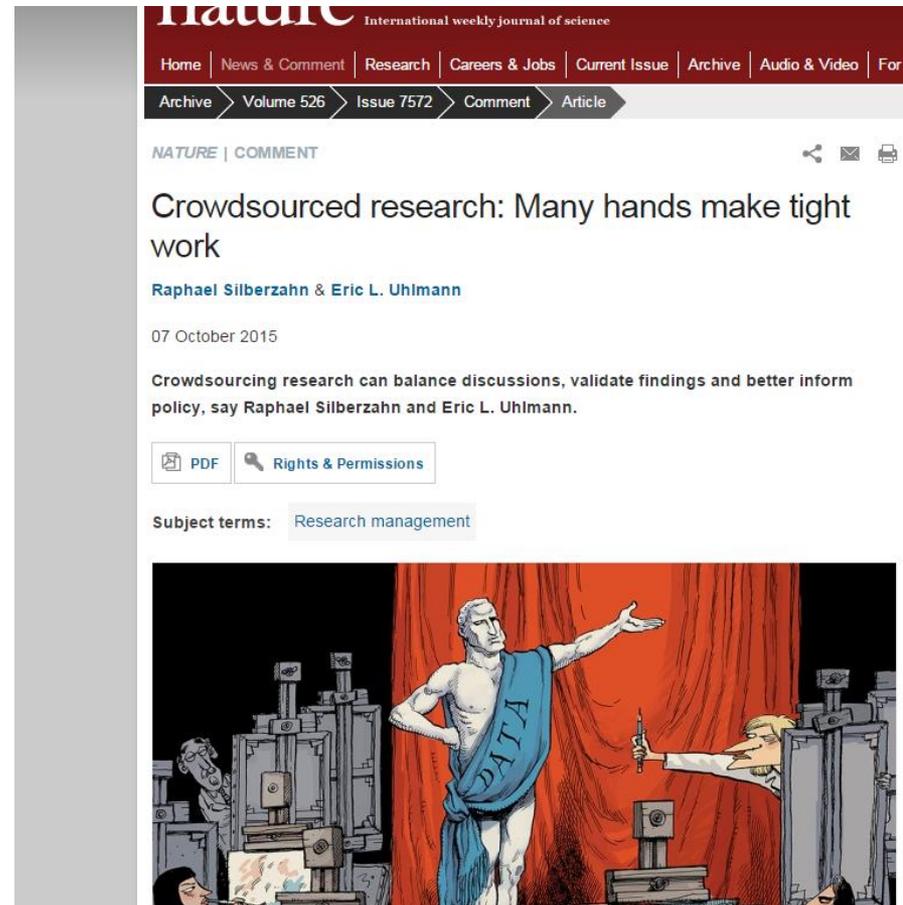


The image shows a screenshot of a web browser displaying the Nature journal website. The page features a dark red header with the 'nature' logo and the tagline 'International weekly journal of science'. Below the header is a navigation menu with links for Home, News & Comment, Research, Careers & Jobs, Current Issue, Archive, Audio & Video, and For. A secondary navigation bar highlights 'Archive', 'Volume 526', 'Issue 7572', 'Comment', and 'Article'. The main content area shows the article title 'Blind analysis: Hide results to seek the truth' by Robert MacCoun & Saul Perlmutter, dated 07 October 2015. A summary line reads: 'More fields should, like particle physics, adopt blind analysis to thwart bias, urge Robert MacCoun and Saul Perlmutter.' At the bottom, there are buttons for 'PDF' and 'Rights & Permissions'.

Further variant in analyses:

Have different team analyse the same data in their own way.

Submission type for a journal?



The image shows a screenshot of a Nature journal article page. The header includes the Nature logo and the text "International weekly journal of science". Navigation links for Home, News & Comment, Research, Careers & Jobs, Current Issue, Archive, Audio & Video, and For are visible. A secondary navigation bar shows Archive, Volume 526, Issue 7572, Comment, and Article. The article title is "Crowdsourced research: Many hands make tight work" by Raphael Silberzahn & Eric L. Uhlmann, dated 07 October 2015. A summary states: "Crowdsourcing research can balance discussions, validate findings and better inform policy, say Raphael Silberzahn and Eric L. Uhlmann." Below the summary are buttons for PDF and Rights & Permissions. The subject terms are listed as "Research management". At the bottom, there is a cartoon illustration of a muscular man in a blue sash labeled "DATA" standing on a stage, gesturing towards a scientist in a white lab coat who is holding a pipette. The background features red curtains and various scientific instruments.

Encourage **adversarial collaborations** (Wagenmakers):

People with opposite views run a replication/test, both collecting data and both analysing the data

What can be done?

i. Pre-registration

ii. Publication of direct replications in prestige journals

Journals should be obliged to published direct replications with high sensitivity?

Pre-registration should encourage direct replications.

What can be done?

i. Pre-registration

ii. Publication of direct replications in prestige journals

iii. Transparency

What can be done?

i. Pre-registration

ii. Publication of direct replications in prestige journals

iii. Transparency

The screenshot shows the website for the Peer Reviewers' Openness Initiative. The header includes the site name and navigation links: WELCOME, THE INITIATIVE, JOIN THE INITIATIVE, GUIDELINES FOR REVIEWERS, and GUIDELINES FOR AUTH. The main content area features a large heading: "The open research revolution begins June 1, 2016. Will you join us?". Below this is a paragraph of text: "We believe that openness and transparency are core values of science. For a long time, technological obstacles existed preventing transparency from being the norm. With the advent of the internet, however, these obstacles have largely disappeared. The promise of open research can finally be realized, but this will require a cultural change in science. The power to create that change lies in the peer-review process." At the bottom of the main content, another paragraph begins: "We suggest that beginning June 1, 2016, reviewers make open practices a pre-condition for more comprehensive review. This is". On the left side, there is a sidebar with a search bar, a "RECENT COMMENTS" section, and a list of comments from Zoltan Dienes, Sonali Marwaha, Richard Morey, and Jeff Rouder.

Peer Reviewers' Openness Initiative

WELCOME THE INITIATIVE JOIN THE INITIATIVE GUIDELINES FOR REVIEWERS GUIDELINES FOR AUTH

Supporting the spread of open research practices

Search ...

**RECENT COMMENTS**

Zoltan Dienes on Join the Initiative

Sonali Marwaha on Join the Initiative

Richard Morey on Join the Initiative

Sonali Marwaha on Join the Initiative

Jeff Rouder on Join the Initiative

## The open research revolution begins June 1, 2016. Will you join us?

We believe that openness and transparency are core values of science. For a long time, technological obstacles existed preventing transparency from being the norm. With the advent of the internet, however, these obstacles have largely disappeared. The promise of open research can finally be realized, but this will require a cultural change in science. The power to create that change lies in the peer-review process.

We suggest that beginning June 1, 2016, reviewers make open practices a pre-condition for more comprehensive review. This is

# American Journal of Political Science

All analyses checked before publication on submitted datasets



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## GUIDELINES FOR MANUSCRIPTS

### INSTRUCTIONS FOR SUBMITTING AUTHORS

The *American Journal of Political Science* (AJPS) seeks manuscripts that make outstanding contributions to scholarly knowledge about notable theoretical concerns, empirical issues, or methodological strategies in any subfield of political science. The AJPS will not review manuscripts

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RECENT POSTS

• The Voters' Curse: Why we need

What can be done?

i. Pre-registration

ii. Publication of direct replications in prestige journals

iii. Transparency

iv. Statistical reform

Now is a time of ferment of exploring different statistical approaches ...

Journals should be open to new approaches to help the exploration

A key debate:

Orthodoxy (significance testing) versus Bayes

Evidence for  $H_0$   
(no difference)

No evidence to  
speak of

Evidence for  $H_1$   
(some difference)

P-values make a two-way distinction:

Evidence for H0  
(no difference)

No evidence to  
speak of

Evidence for H1  
(some difference)

P-values make a two distinction:

Evidence for H0  
(no difference)

No evidence to  
speak of

Evidence for H1  
(some difference)

NO MATTER WHAT THE P-VALUE, NO DISTINCTION  
MADE WITHIN THIS BOX



Bayes factors make the three way distinction:

0 ... 1/3

1/3 ... 3

3 ...

Evidence for H0  
(no difference)

No evidence to  
speak of

Evidence for H1  
(some difference)

### Calculate your Bayes factor

Is the distribution of  $p(\text{population value}|\text{theory})$  uniform?  yes  no

What is the sample standard error?

What is the sample mean?

The likelihood of the obtained data given your theory is

The likelihood of the obtained data given the null is

The Bayes factor is

[< Archive](#)

**METHODS ARTICLE**

Front. Psychol., 29 July 2014 | <http://dx.doi.org/10.3389/fpsyg.2014.00781>

## Using Bayes to get the most out of non-significant results

 **Zoltan Dienes\***

School of Psychology and Sackler Centre for Consciousness Science, University of Sussex, Brighton, UK

scientific conclusion follows automatically from a statistically non-significant result, yet people routinely use non-significant results to guide conclusions about the status of theories (or the effectiveness of practices). To know whether a significant result counts against a theory, or if it just indicates data insensitivity, researchers must use one of: power, alphas (such as confidence or credibility intervals), or else an indicator of the relative evidence for one theory over another, such as a Bayes factor. I argue Bayes factors allow theory to be linked to data in a way that overcomes the weaknesses of the other approaches. Specifically, Bayes factors use the data themselves to determine their sensitivity in distinguishing (unlike p-values) between a theory and the null hypothesis (unlike Bayes factors).

# JASP

A Fresh Way to Do Statistics

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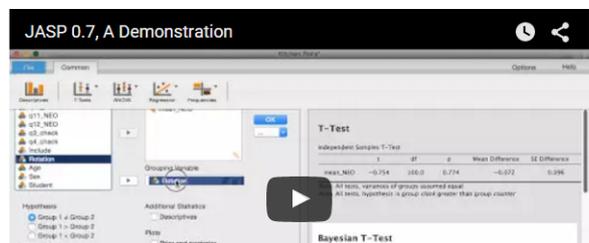
## JASP

JASP, a low fat alternative to SPSS, a delicious alternative to R. Bayesian statistics made accessible.

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Publications **Bayes Factor Calculators** Code/Data/Stimuli For Lab Members

# Perception and Cognition Lab

Department of Psychological Sciences, University of Missouri

### Bayes Factor Calculators

Our goal is to provide a convenient set of web-based Bayes factor calculators. Currently, we have implemented calculators for:

- Paired or one-sample t-tests
- Grouped or two-sample t-tests
- Regression
- Paired t-tests where the null is an equivalence region rather than a point
- Binomially Distributed Observation

**News: Release of Bayes Factor Package**

	LEVEL 0	LEVEL 1	LEVEL 2	LEVEL 3
<b>Citation standards</b>	Journal encourages citation of data, code, and materials—or says nothing.	Journal describes citation of data in guidelines to authors with clear rules and examples.	Article provides appropriate citation for data and materials used, consistent with journal's author guidelines.	Article is not published until appropriate citation for data and materials is provided that follows journal's author guidelines.
<b>Data transparency</b>	Journal encourages data sharing—or says nothing.	Article states whether data are available and, if so, where to access them.	Data must be posted to a trusted repository. Exceptions must be identified at article submission.	Data must be posted to a trusted repository, and reported analyses will be reproduced independently before publication.
<b>Analytic methods (code) transparency</b>	Journal encourages code sharing—or says nothing.	Article states whether code is available and, if so, where to access them.	Code must be posted to a trusted repository. Exceptions must be identified at article submission.	Code must be posted to a trusted repository, and reported analyses will be reproduced independently before publication.
<b>Research materials transparency</b>	Journal encourages materials sharing—or says nothing	Article states whether materials are available and, if so, where to access them.	Materials must be posted to a trusted repository. Exceptions must be identified at article submission.	Materials must be posted to a trusted repository, and reported analyses will be reproduced independently before publication.
<b>Design and analysis transparency</b>	Journal encourages design and analysis transparency or says nothing.	Journal articulates design transparency standards.	Journal requires adherence to design transparency standards for review and publication.	Journal requires and enforces adherence to design transparency standards for review and publication.

Summary of the eight standards and three levels of the TOP guidelines

	LEVEL 0	LEVEL 1	LEVEL 2	LEVEL 3
<b>Preregistration of studies</b>	Journal says nothing.	Journal encourages preregistration of studies and provides link in article to preregistration if it exists.	Journal encourages preregistration of studies and provides link in article and certification of meeting preregistration badge requirements.	Journal requires preregistration of studies and provides link and badge in article to meeting requirements.
<b>Preregistration of analysis plans</b>	Journal says nothing.	Journal encourages preanalysis plans and provides link in article to registered analysis plan if it exists.	Journal encourages preanalysis plans and provides link in article and certification of meeting registered analysis plan badge requirements.	Journal requires preregistration of studies with analysis plans and provides link and badge in article to meeting requirements.
<b>Replication</b>	Journal discourages submission of replication studies—or says nothing.	Journal encourages submission of replication studies.	Journal encourages submission of replication studies and conducts blind review of results.	Journal uses Registered Reports as a submission option for replication studies with peer review before observing the study outcomes.

Levels 1 to 3 are increasingly stringent for each standard. Level 0 offers a comparison that does not meet the standard.

What can be done?

i. Pre-registration

ii. Publication of direct replications in prestige journals

iii. Transparency

iv. Statistical reform

**v. Institutional reform**

Why the credibility crisis now?

Maybe performance management based on simplistic criteria (Key Performance Indicators): getting papers published, getting grants .....

Change in last 10 years: A separate management class who are only incentivized to apply strong top down pressure to achieve KPIs

What if we implemented an Athenian democracy at a university so that academics – who care about research quality – made the decisions ...??

