

# Is there really a crisis in science?

@andreasaltelli, Centre for the Study of the Sciences and the Humanities,  
University of Bergen &  
Institut de Ciència i Tecnologia Ambientals – Universitat Autònoma de Barcelona

Seminar at Technical University of Denmark – DTU, Lyngby  
Campus, Chemical Engineering, June 1<sup>st</sup> 2017





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CAETERIS ARE NEVER  
PARIBUS

### Tweets by @AndreaSaltelli



andrea saltelli  
@AndreaSaltelli

"Science is not some magic force for progress  
and democracy"

Almost exactly the words used by J. Dewey:  
[twitter.com/AndreaSaltelli](https://twitter.com/AndreaSaltelli) ...



En



andrea saltelli  
@AndreaSaltelli

Lecturing today in Brno with @SFuntowicz and  
@BDMarchi

The crises, the marches, the disasters and  
beyond.

post-normal science  
v České republice

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**sensitivity analysis, sensitivity auditing, science for policy, impact  
assessment**

The spirit of P

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Review



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**Cite this article:** Colquhoun D. 2014 An investigation of the false discovery rate and the misinterpretation of  $p$ -values. *R. Soc. open sci.* **1**: 140216.

<http://dx.doi.org/10.1098/rsos.140216>

# An investigation of the false discovery rate and the misinterpretation of $p$ -values


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David Colquhoun

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Department of Neuroscience, Physiology and Pharmacology, University College London, Gower Street, London WC1 6BT, UK

“If you are foolish enough to define ‘statistically significant’ as anything less than  $p=0.05$  then... you have a 29% chance (at least) of making a fool of yourself.



Who would take a risk like that? Judging by the medical literature, most people would. No wonder there is a problem”

## P values by way of an example

- Two groups, one with a placebo, one with the treatment
- Random allocation to groups (+more!)
- The difference  $d$  between the means of the two groups is tested (is it different from zero?)
- $p=0.05$  implies that if there were no effect the probability of observing a value equal to  $d$  or higher would be 5%

“At first sight, it might be thought that this procedure would guarantee that you would make a fool of yourself only once in every 20 times that you do a test”

Colquhoun D. 2014 An investigation of the false discovery rate and the misinterpretation of p-values. R. Soc. Open sci. 1: 140216. <http://dx.doi.org/10.1098/rsos.140216>

“The classical p-value does exactly what it says. But it is a statement about what would happen if there were no true effect. That cannot tell you about your long-term probability of making a fool of yourself, simply because sometimes there really is an effect. In order to do the calculation, **we need to know a few more things**”

Colquhoun D. 2014 An investigation of the false discovery rate and the misinterpretation of p-values. R. Soc. Open sci. 1: 140216. <http://dx.doi.org/10.1098/rsos.140216>



## A classic exercise in screening

You test positive for AIDS (one test only). Time for despair?

Only one 1 in 100,000 has AIDS in your population

The test has a 5% false positive rate

Already one can say: in a population of say 100,000 one will have AIDS and 5,000 (5% of 100,000) will test positive

➔ Don't despair (yet)

## Another exercise in screening (Colquhoun 2014)

You test positive for mild cognitive impairment (MCI) (one test only).  
Time to retire?

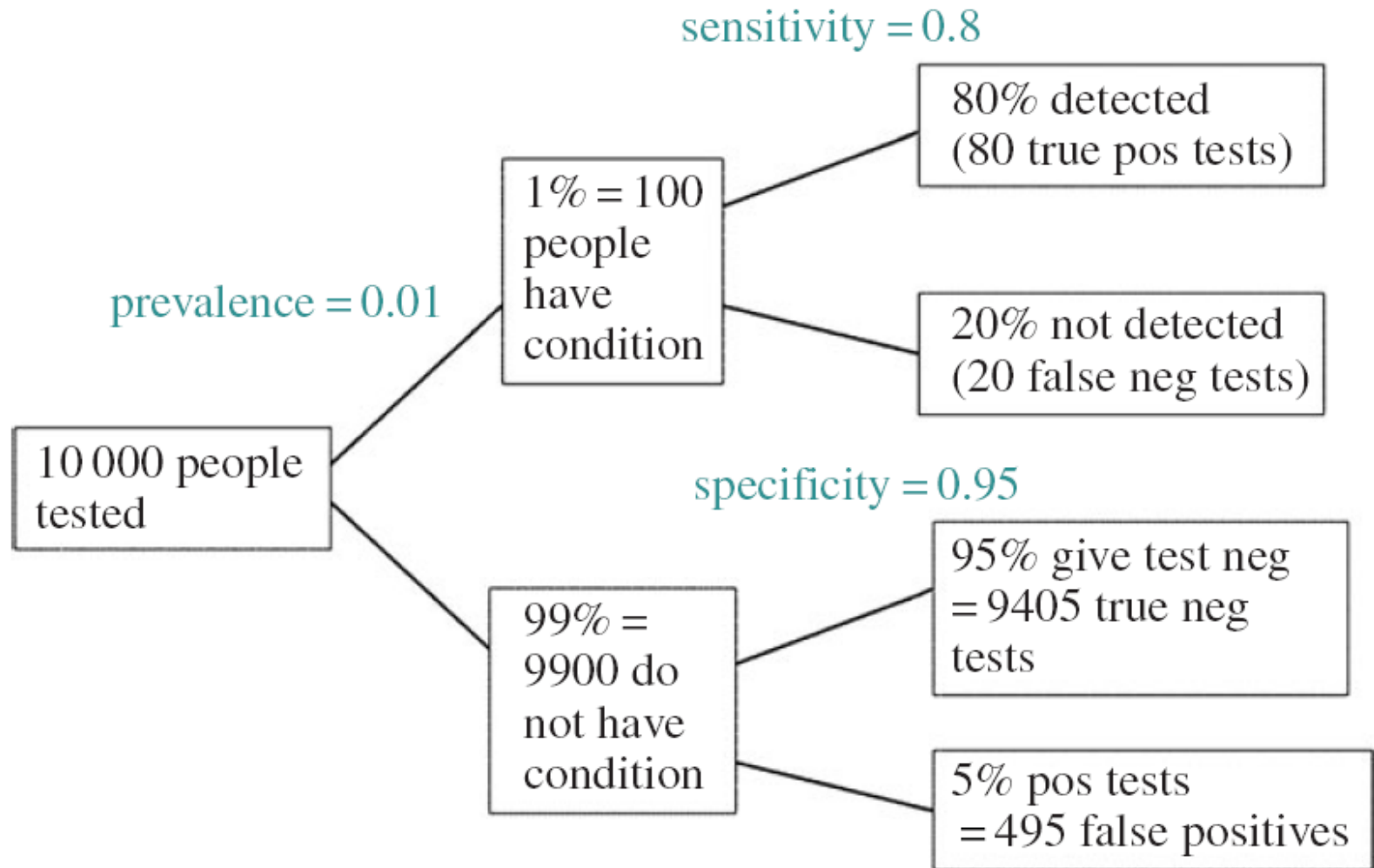
MCI prevalence in the population 1%, i.e. in a sample of 10,000 then 100 have MCI and 9,900 don't

The test has a 5% **false positive** rate; of the 9,900 who don't have MCI 495 test (false) positive and the remaining 9,405 (true) negative

The test does not pick all the 100 MCI but only 80; there will be 20 **false negative**. So we see  $80 + 495 = 575$  positive of which only 80 (a 14%) are true and the remaining 86% false

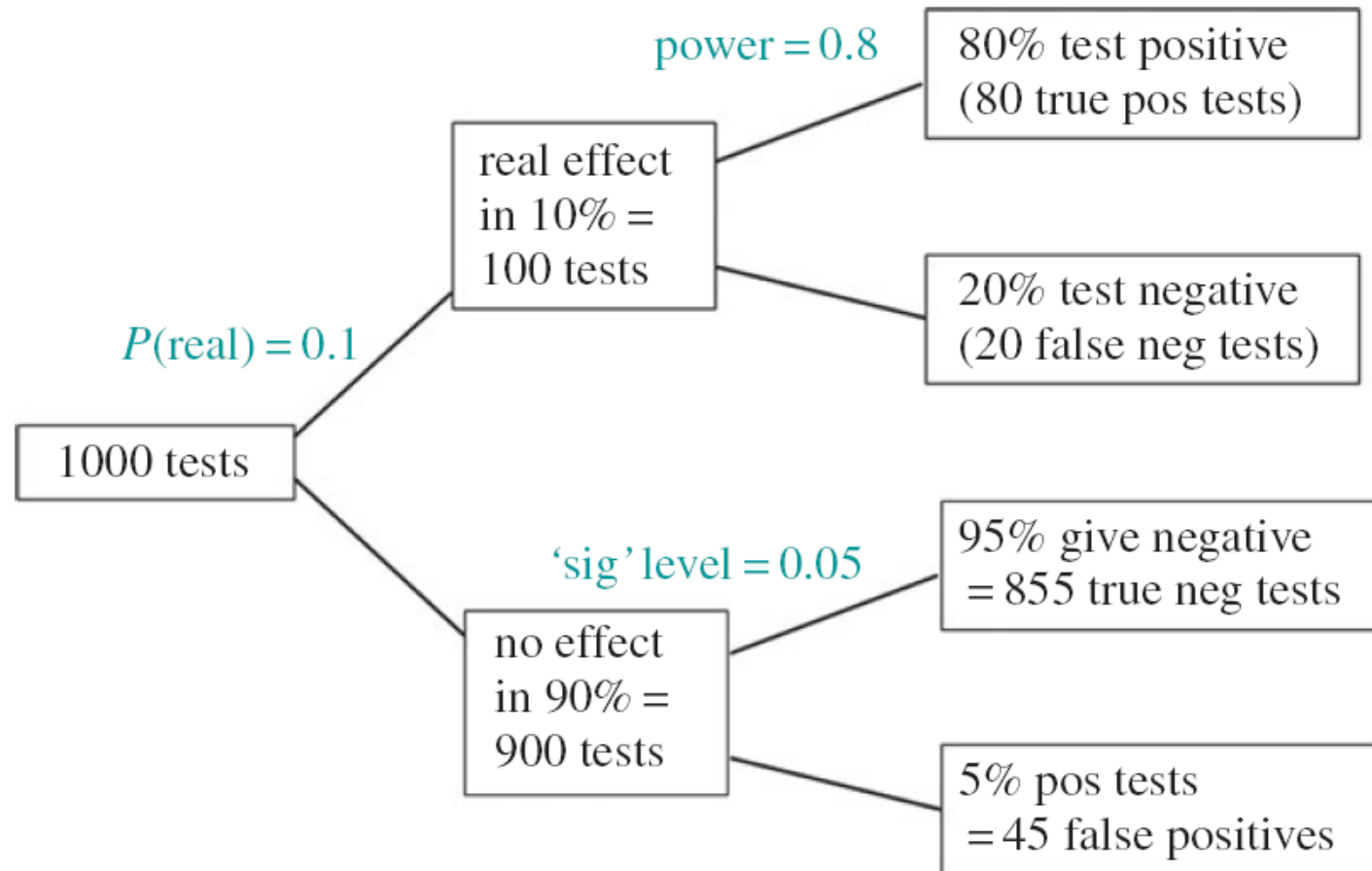
➔ It does not make sense to screen the population for MCI!

The number  $86\% = 495/(495+80)$  is our false discovery rate



The same concept of false discovery rate applies to the problem of significance test in experimental life

# We now consider tests (**studies!**) instead of individuals

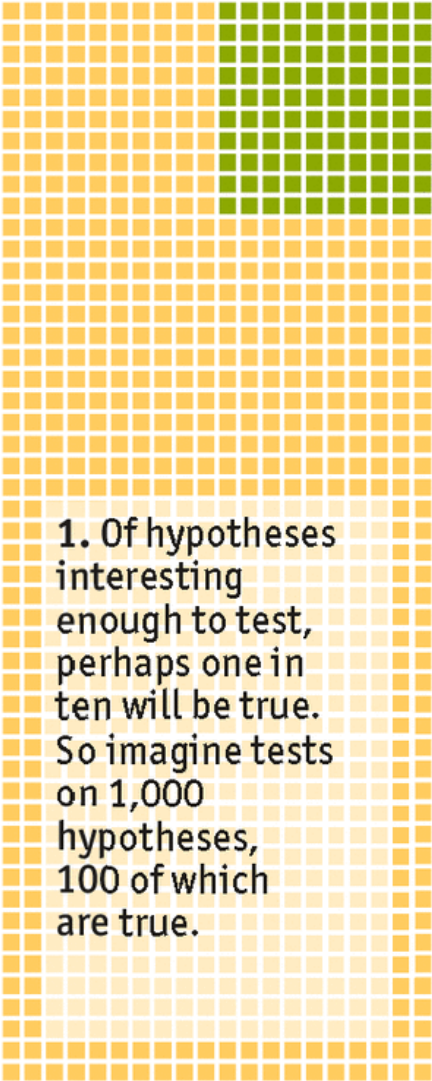


## Unlikely results

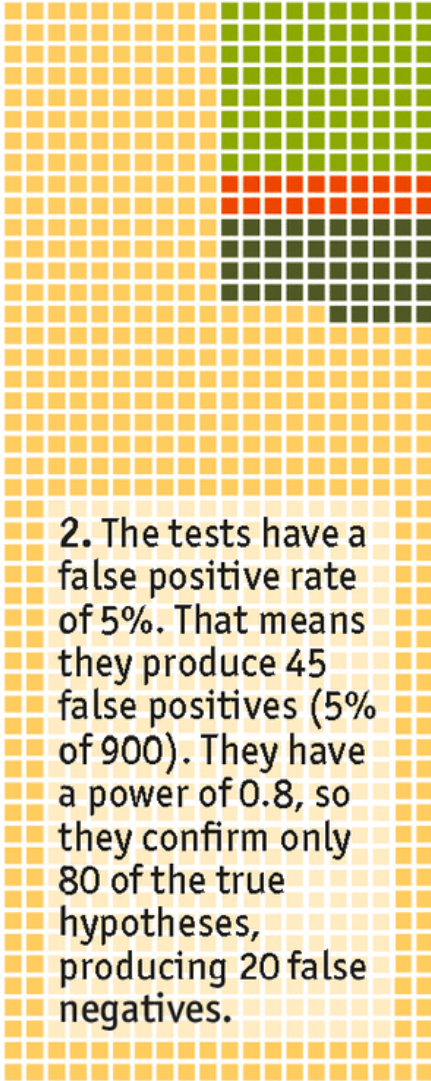
How a small proportion of false positives can prove very misleading

False True False negatives False positives

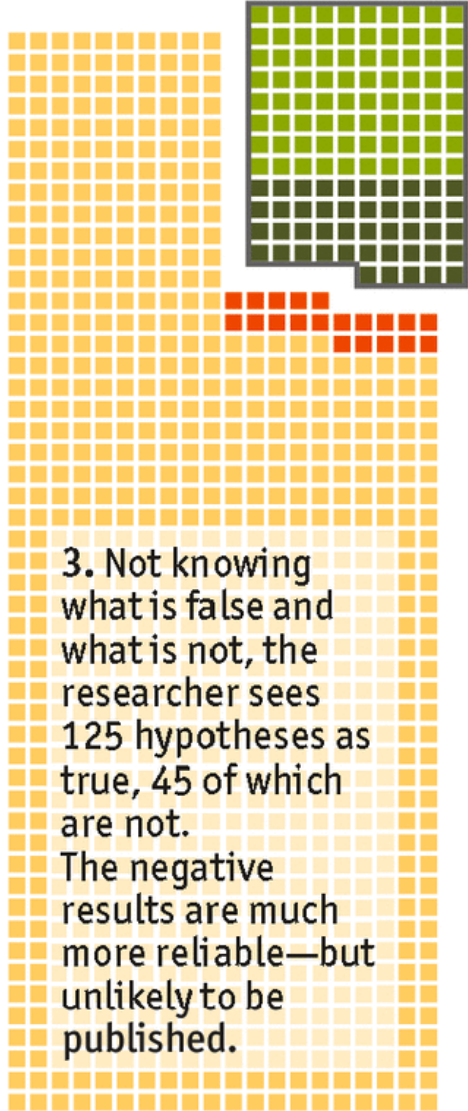
The false discovery rate is  $\sim$  the dark divided by the light green



1. Of hypotheses interesting enough to test, perhaps one in ten will be true. So imagine tests on 1,000 hypotheses, 100 of which are true.



2. The tests have a false positive rate of 5%. That means they produce 45 false positives (5% of 900). They have a power of 0.8, so they confirm only 80 of the true hypotheses, producing 20 false negatives.



3. Not knowing what is false and what is not, the researcher sees 125 hypotheses as true, 45 of which are not. The negative results are much more reliable—but unlikely to be published.

➔ We see 125 hypotheses as true 45 of which are not;  
the false discovery rate is  $45/125 = 36\%$

Significance  $p=0.05$  ➔ false discovery rate of 36%

We now know that  $p=0.05$  did not correspond to a  
chance in twenty of being wrong **but to one in three**

How many numbers did we need to know to reach this  
conclusion?



The curse of P



# Replicability-Index

*Improving the replicability of empirical research*



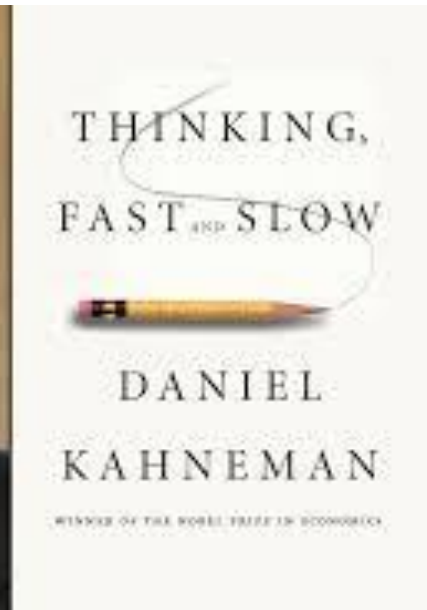
## Reconstruction of a Train Wreck: How Priming Research Went off the Rails

🕒 February 2, 2017    📖 Kahneman, Priming, r-index, Statistical Power, Thinking Fast and Slow

**Authors: Ulrich Schimmack, Moritz Heene, and Kamini Kesavan**



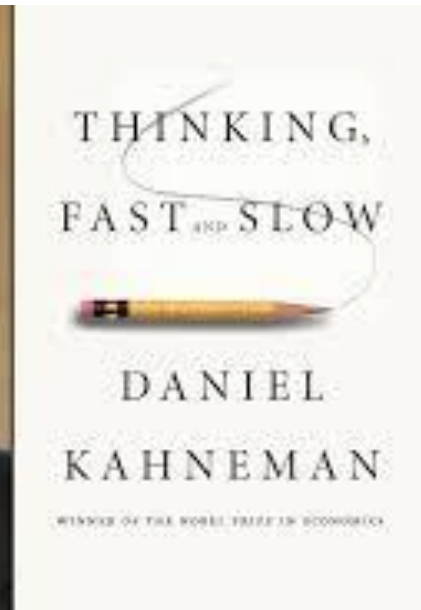
Reconstruction of a Train Wreck: How Priming Research Went off the Rails



“[...]questions have been raised about the robustness of priming results ... your field is now the poster child for doubts about the integrity of psychological research...”

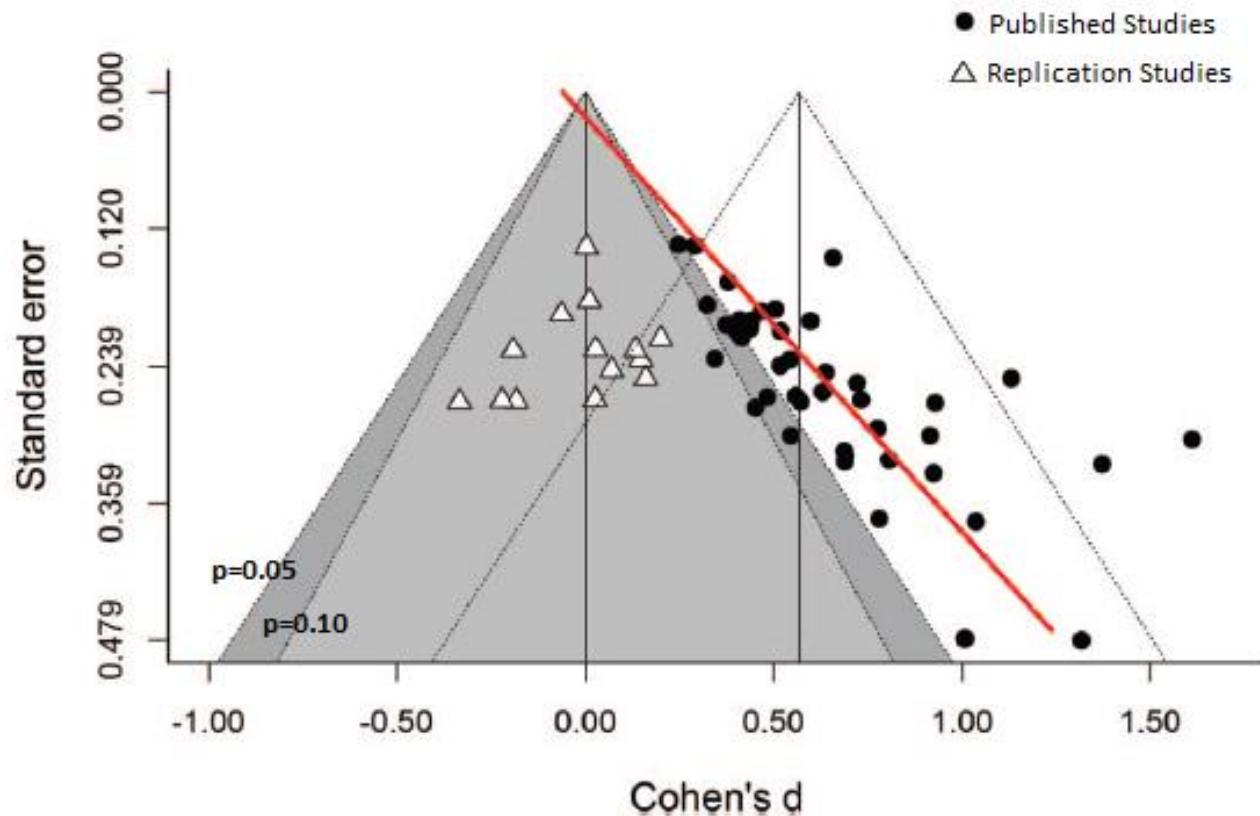


Reconstruction of a Train Wreck: How Priming Research Went off the Rails



“... people have now attached a question mark to the field, and it is your responsibility to remove it... I recently wrote a book that emphasizes priming research ... My reason for writing this letter is that I see a train wreck looming” (Kahneman, 2012)

# P-hacking; a smoking gun?



Shanks et al. (2015) JEP:General

J Exp Psychol Gen. 2015 Oct 26. "Romance, Risk, and Replication: Can Consumer Choices and Risk-Taking Be Primed by Mating Motives?", Shanks DR, Vadillo MA, Riedel B, Clymo A, Govind S, Hickin N, Tamman AJ, Puhmann LM.: <http://www.ncbi.nlm.nih.gov/pubmed/26501730>

REPRODUCIBILITY

# Statisticians issue warning on *P* values

*Statement aims to halt missteps in the quest for certainty.*

“Misuse of the *P* value — a common test for judging the strength of scientific evidence — is contributing to the number of research findings that cannot be reproduced”

Baker, M., 2016, Statisticians issue warning on *P* values, *Nature*, 531, 151

## AMERICAN STATISTICAL ASSOCIATION RELEASES STATEMENT ON STATISTICAL SIGNIFICANCE AND *P*-VALUES

*Provides Principles to Improve the Conduct and Interpretation of Quantitative  
Science*

March 7, 2016

... and twenty ‘dissenting’ commentaries

Wasserstein, R.L. and Lazar, N.A., 2016. ‘The ASA's statement on p-values: context, process, and purpose’, *The American Statistician*, DOI:10.1080/00031305.2016.1154108.

See also Christie Aschwanden at <http://fivethirtyeight.com/features/not-even-scientists-can-easily-explain-p-values/>

**Special Issue:**

Bayesian Probability and Statistics  
in Management Research

Journal of Management

Vol. 41 No. 2, February 2015 421–440

DOI: 10.1177/0149206314547522

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## Editorial Commentary

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# Surrogate Science: The Idol of a Universal Method for Scientific Inference

Gerd Gigerenzer

*Max Planck Institute for Human Development*

Julian N. Marewski

*University of Lausanne*

There is no universal method of scientific inference ...

...it is better to have no beliefs than to embrace falsehoods...

Statistical methods are not simply applied to a discipline; they change the discipline itself, ...

**Special Issue:**  
Bayesian Probability and Statistics  
in Management Research

Journal of Management  
Vol. 41 No. 2, February 2015 421–440  
DOI: 10.1177/0149206314547522  
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### Editorial Commentary

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## Surrogate Science: The Idol of a Universal Method for Scientific Inference

Gerd Gigerenzer

*Max Planck Institute for Human Development*

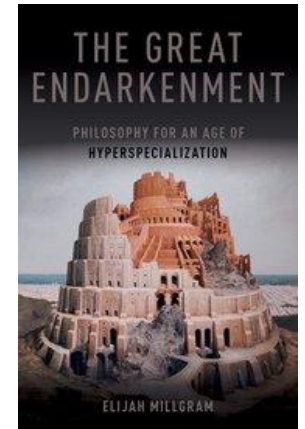
Julian N. Marewski

*University of Lausanne*



How was it possible that this important statistical tool was misused for several decades with grave consequences for science?

The Great Endarkenment.  
Philosophy for an Age of Hyperspecialization  
By Elijah Millgram



Describes a world in which all knowledge and products are the result of some form of extremely specialized expertise, and in which expertise is itself highly circumscribed, since experts depend in turn on other experts whose knowledge claims and styles of argumentation cannot be exported from one discipline to the next. ➔ “serial hyperspecializers” (p. 26)

Experts thus become “logical aliens” (p. 32)

Theses for today

**First thesis:** Science is in a deep existential crisis which has ethical, epistemological, methodological and even metaphysical dimensions.



THE RIGHTFUL  
PLACE OF SCIENCE:  
**SCIENCE ON THE  
VERGE**

CONTRIBUTORS

Alice Benessia	Jerome R. Ravetz
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Mario Giampietro	Roger Strand
Ângela Guimarães Pereira	Jeroen P. van der Sluijs

A crisis looms over the scientific enterprise. Not a day passes without news of retractions, failed replications, fraudulent peer reviews, or misinformed science-based policies

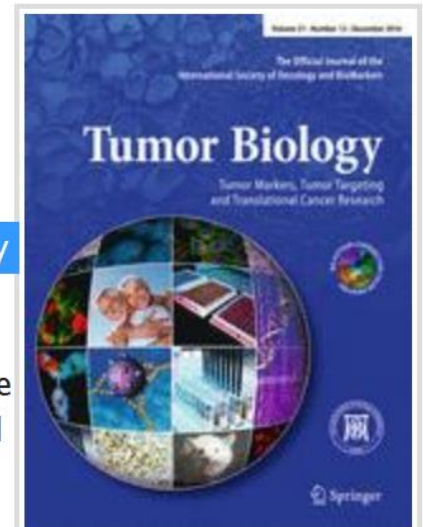


## A new record: Major publisher retracting more than 100 studies from cancer journal over fake peer reviews

with 11 comments

Springer is [retracting 107 papers](#) from one journal after discovering they had been accepted with fake peer reviews. Yes, 107.

To submit a fake review, someone (often the author of a paper) either makes up an outside expert to review the paper, or suggests a real researcher — and in both cases, provides a fake email address that comes back to someone who will invariably give the paper a glowing review. In this case, Springer, the publisher of *Tumor Biology* through 2016, told us that an investigation produced “clear evidence” the reviews were submitted under the names of real researchers with faked emails. Some of the authors may have used a third-party editing service, which may have supplied the reviews. The [journal is now published by SAGE](#).



# Reproducibility in cancer biology: Making sense of replications



Brian A Nosek, Timothy M Errington

Center for Open Science, United States; University of Virginia, United States

DOI: <http://dx.doi.org/10.7554/eLife.23383>

Published January 19, 2017

Cite as eLife 2017;6:e23383

January 19, 2017

## 1-1 Abstract

The first results from the Reproducibility Project: Cancer Biology suggest that there is scope for improving reproducibility in pre-clinical cancer research.

DOI: <http://dx.doi.org/10.7554/eLife.23383.001>

PART OF A  
REPRODUCIBILITY PROJECT  
Cancer Biology

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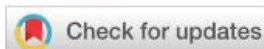
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Proceedings of the National Academy of Sciences of the United States of America

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[Home](#) > [Current Issue](#) > vol. 114 no. 14 > Daniele Fanelli, 3714–3719, doi: 10.1073/pnas.1618569114



## Meta-assessment of bias in science

April 04, 2017

Daniele Fanelli<sup>a,1</sup>, Rodrigo Costas<sup>b</sup>, and John P. A. Ioannidis<sup>a,c,d,e</sup>

Author Affiliations

Edited by Susan T. Fiske, Princeton University, Princeton, NJ, and approved February 14, 2017 (received for review November 8, 2016)

## This Issue



April 4, 2017  
vol. 114 no. 14  
[Masthead \(PDF\)](#)  
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## Feature

## Coca-Cola's secret influence on medical and science journalists

*BMJ* 2017 ;357 doi: <https://doi.org/10.1136/bmj.j1638> (Published 05 April 2017)

Cite this as: *BMJ* 2017;357;j1638

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*Paul Thacker, freelance journalist*

[Author affiliations ▾](#)

[thackerpd@gmail.com](mailto:thackerpd@gmail.com)

April 05, 2017

“Industry money was used to covertly influence journalists with the message that exercise is a bigger problem than sugar consumption in the obesity epidemic, documents obtained under freedom of information laws show.

[...] When challenged about funding of the series of conferences, the academics involved weren't forthcoming about industry involvement.”



# JAMA Internal Medicine

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Special Communication | September 12, 2016

## Sugar Industry and Coronary Heart Disease Research

### A Historical Analysis of Internal Industry Documents FREE

**ONLINE FIRST**

Cristin E. Kearns, DDS, MBA<sup>1,2</sup>; Laura A. Schmidt, PhD, MSW, MPH<sup>1,3,4</sup>; Stanton A. Glantz, PhD<sup>1,5,6,7,8</sup>

[\[+\] Author Affiliations](#)

*JAMA Intern Med.* Published online September 12, 2016. doi:10.1001/jamainternmed.2016.5394

Text Size: [A](#) [A](#) [A](#)

See also <https://www.theguardian.com/society/2016/apr/07/the-sugar-conspiracy-robert-lustig-john-yudkin>, and the story of US President Dwight Eisenhower heart attack,...

“our findings suggest the industry sponsored a research program in the 1960s and 1970s that successfully cast doubt about the hazards of sucrose while promoting fat as the dietary culprit in CHD [coronary heart disease]”

The screenshot shows the JAMA Internal Medicine website. At the top, there is a dark navigation bar with links: The JAMA Network, Journals >, Collections, Store, Physician Jobs, and About Mobile. Below this is the JAMA Internal Medicine logo. A secondary navigation bar contains links: Home, Current Issue, All Issues, Online First, Collections, CME, and Multimedia. The main content area is titled 'Online First >' and features a 'Special Communication | September 12, 2016'. The article title is 'Sugar Industry and Coronary Heart Disease Research', followed by the subtitle 'A Historical Analysis of Internal Industry Documents'. A 'FREE' badge is next to the subtitle. Below the title is an 'ONLINE FIRST' badge. The authors listed are 'Cristin E. Kearns, DDS, MBA<sup>1,2</sup>; Laura A. Schmidt, PhD, MSW, MPH<sup>1,3,4</sup>; Stanton A. Glantz, PhD<sup>1,5,6,7,8</sup>'. There is a link for '[+] Author Affiliations'. At the bottom, it says 'JAMA Intern Med. Published online September 12, 2016. doi:10.1001/jamainternmed.2016.5394'. In the bottom right corner, there is a 'Text Size' option with three icons: A, A, A.

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Special Communication | September 12, 2016

**Sugar Industry and Coronary Heart Disease Research**

**A Historical Analysis of Internal Industry Documents** FREE

**ONLINE FIRST**

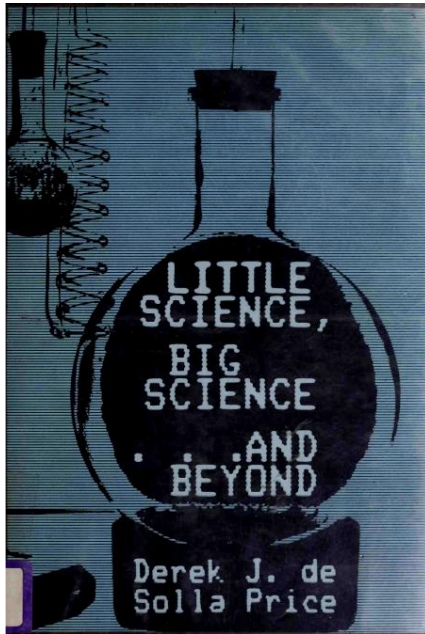
Cristin E. Kearns, DDS, MBA<sup>1,2</sup>; Laura A. Schmidt, PhD, MSW, MPH<sup>1,3,4</sup>; Stanton A. Glantz, PhD<sup>1,5,6,7,8</sup>

[+] Author Affiliations

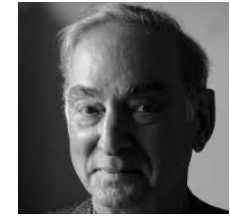
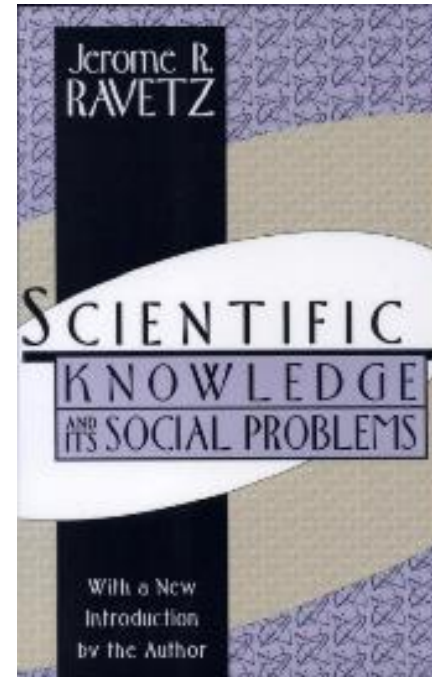
JAMA Intern Med. Published online September 12, 2016. doi:10.1001/jamainternmed.2016.5394

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The crisis was predicted by E. de Solla Price, Jerome R. Ravetz and others five decades ago



Derek J. de  
Solla Price

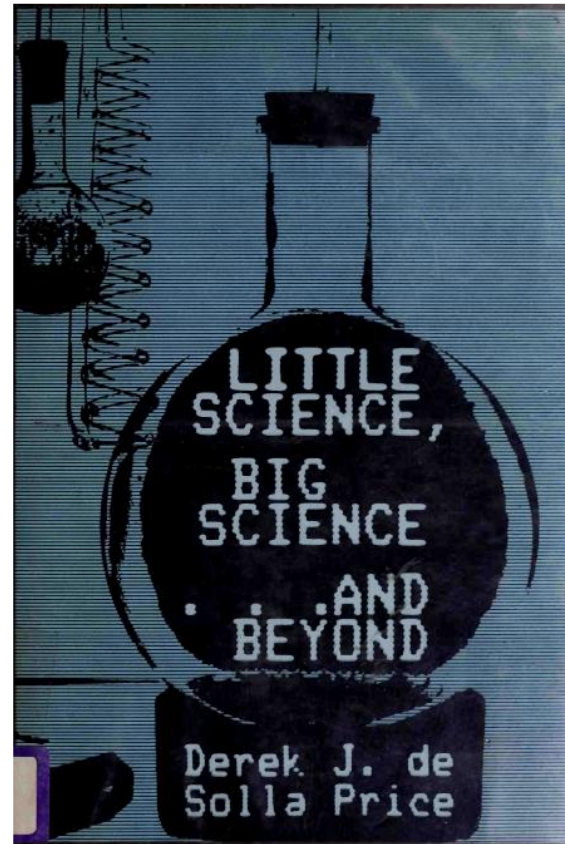


Jerome R.  
Ravetz

de Solla Price, D.J., 1963, Little science big science, Columbia University Press.

Ravetz, J., 1971, Scientific Knowledge and its Social Problems, Oxford University Press.

In 1963 Derek J. de Solla Price prophesized that Science would reach saturation (and in the worst case senility) under its own weight, victim of its own success and exponential growth (pp 1-32).



Derek J. de Solla Price

de Solla Price, D.J., 1963, Little science big science, Columbia University Press.



# Science/knowledge degenerates when it becomes a commodity for Ravetz (1971), and Mirowski (2011).

Ravetz, J., 1971, *Scientific Knowledge and its Social Problems*, Oxford University Press, p. 22.

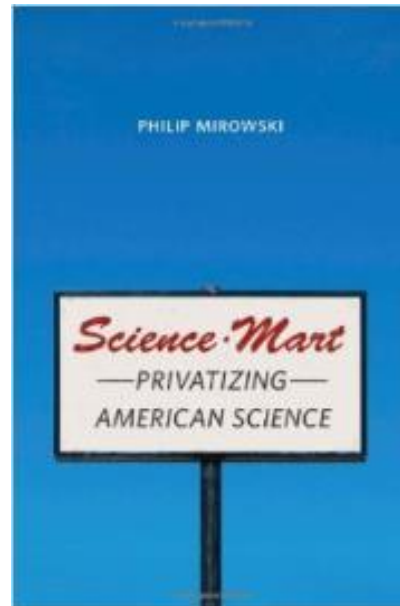
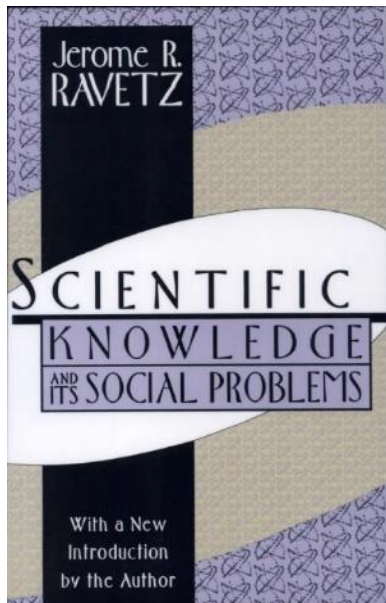
Mirowski, P. 2011. *Science-Mart: Privatizing American Science*, Harvard University Press.



Jerome R.  
Ravetz

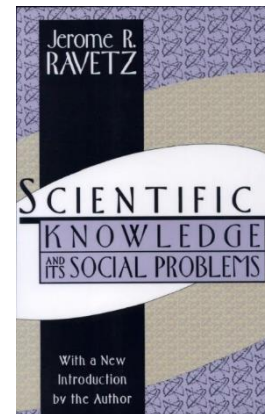


Philip  
Mirowski





p.22: “with the industrialization of science, certain changes have occurred which weaken the operation of the traditional mechanism of quality control and direction at the highest level.

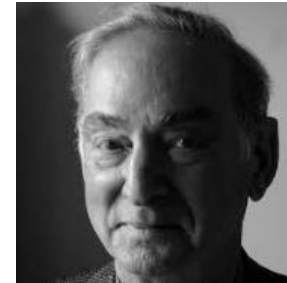
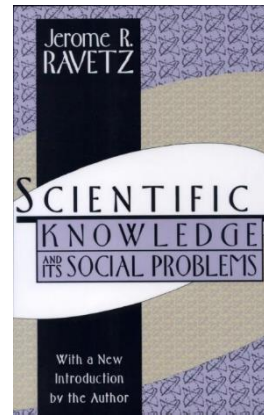


Jerome R.  
Ravetz

Ravetz, J., 1971, Scientific Knowledge and its Social Problems, Oxford University Press, p.22.



p.22: [...] The problem of quality control in science is thus at the centre of the social problems of the industrialized science of the present period.”

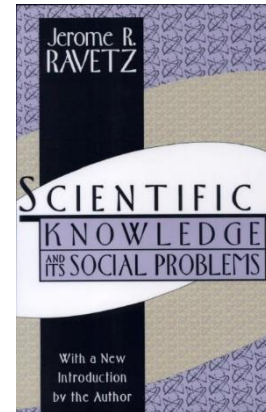


Jerome R.  
Ravetz

Ravetz, J., 1971, Scientific Knowledge and its Social Problems, Oxford University Press, p.22.



p.22: “If [science] fails to resolve this problem [...] then the immediate consequences for morale and recruitment will be serious; and those for the survival of science itself, grave”



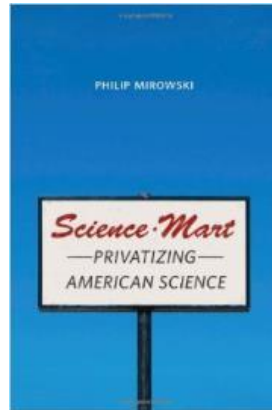
Jerome R.  
Ravetz

Ravetz, J., 1971, Scientific Knowledge and its Social Problems, Oxford University Press, p.22.





In house science labs of major corporation were closed and research outsourced to universities which ... became more and more looking as profit seeking organization (technology transfer offices in every campus) ... then research ended up outsourced again to contract-based research organizations (CRO's)...



Philip Mirowski

Mirowski, P. 2011. Science-Mart: Privatizing American Science, Harvard University Press.



Unreliable research

## Trouble at the lab

Scientists like to think of science as self-correcting. To an alarming degree, it is not

Oct 19th 2013 | From the print edition



22K



John P. A.  
Ioannides

Open access, freely available online

Essay

## Why Most Published Research Findings Are False

John P. A. Ioannidis

J. P. A. Ioannidis, Why Most  
Published Research  
Findings Are False, PLoS  
Medicine, August 2005,  
2(8), 696–701.

Essay

# Why Most Published Research Findings Are False

John P. A. Ioannidis



John P. A.  
Ioannides

relationships proposed 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.

J. P. A. Ioannidis, Why Most Published Research Findings Are False, PLoS Medicine, August 2005, 2(8), 696–701.

# More from the same author

## Summary Points

- Currently, many published research findings are false or exaggerated, and an estimated 85% of research resources are wasted.



John P. A.  
Ioannides

Ioannidis, J. P. (2014). How to Make More Published Research True. PLoS medicine, 11(10), e1001747

Ioannidis JPA, 2016, Why Most Clinical Research Is Not Useful, PLoS Med 13(6): e1002049. doi:10.1371/journal.pmed.1002049

## THE LANCET

Volume 376 - Number 9734 - Pages 3-68 - July 3-9, 2010

www.thelancet.com

For Lancet (2015) an estimated US\$200 billion were wasted in the US in 2010.

Lancet, Editorial, 2015, Rewarding true inquiry and diligence in research, 385, p. 2121.

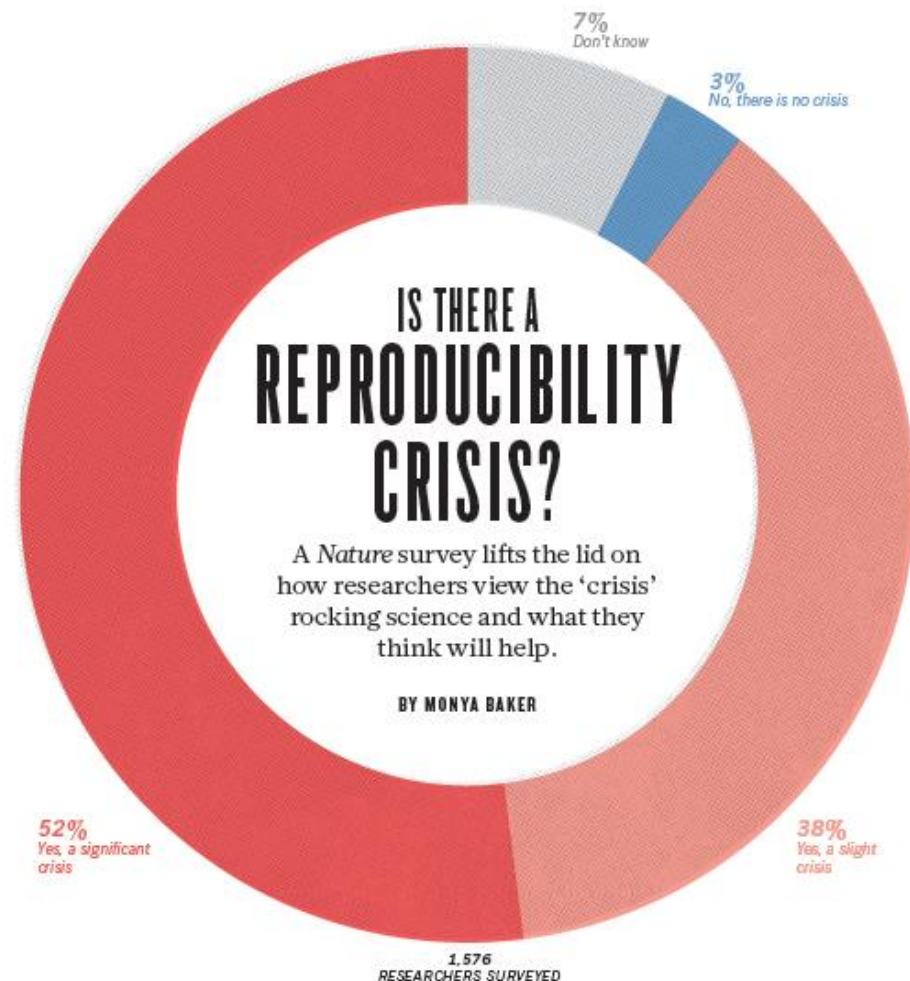
NATURE | NEWS FEATURE

# 1,500 scientists lift the lid on reproducibility

Survey sheds light on the 'crisis' rocking research.

Monya Baker

25 May 2016 | Corrected: 28 July 2016



<http://www.nature.com/news/1-500-scientists-lift-the-lid-on-reproducibility-1.19970>



## 1,500 scientists lift the lid on reproducibility

Survey sheds light on the 'crisis' rocking research.

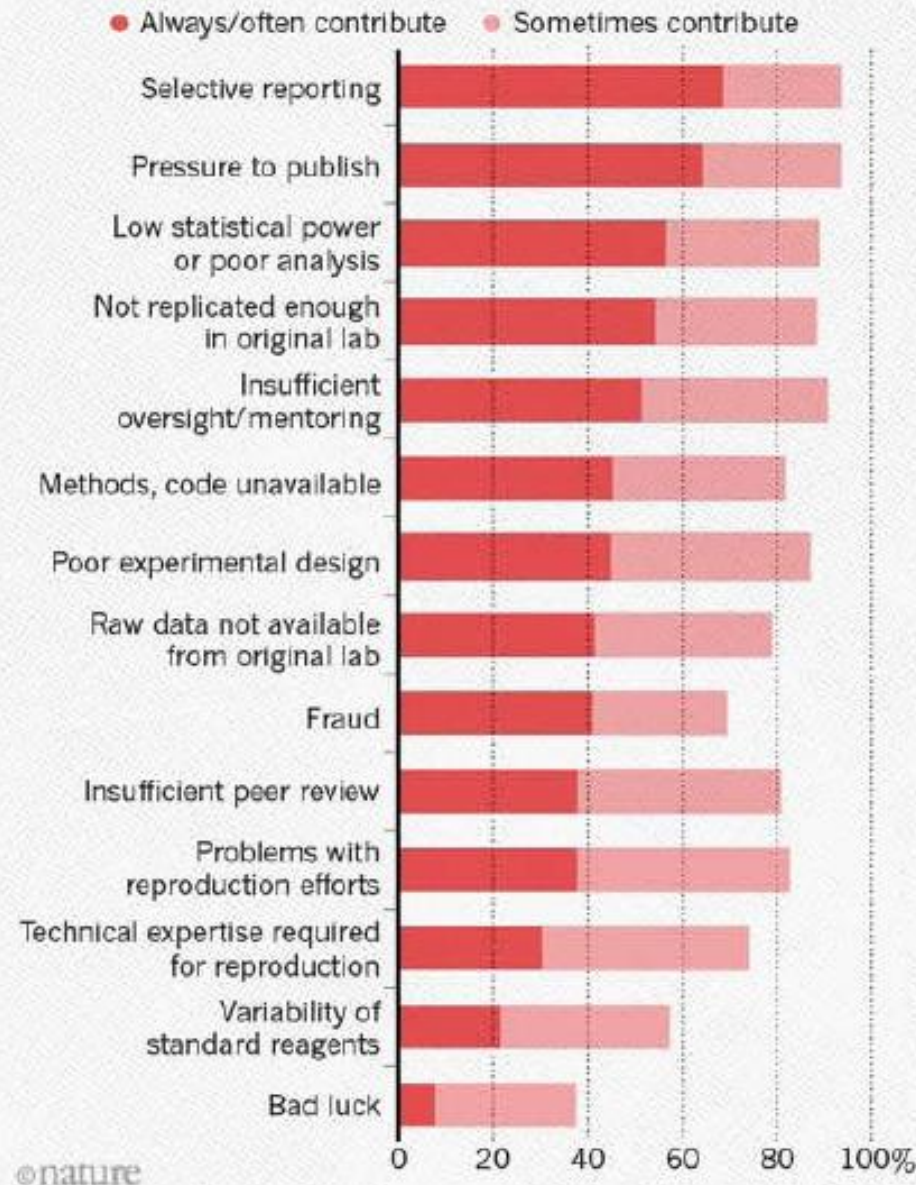
Monya Baker

25 May 2016 | Corrected: 28 July 2016

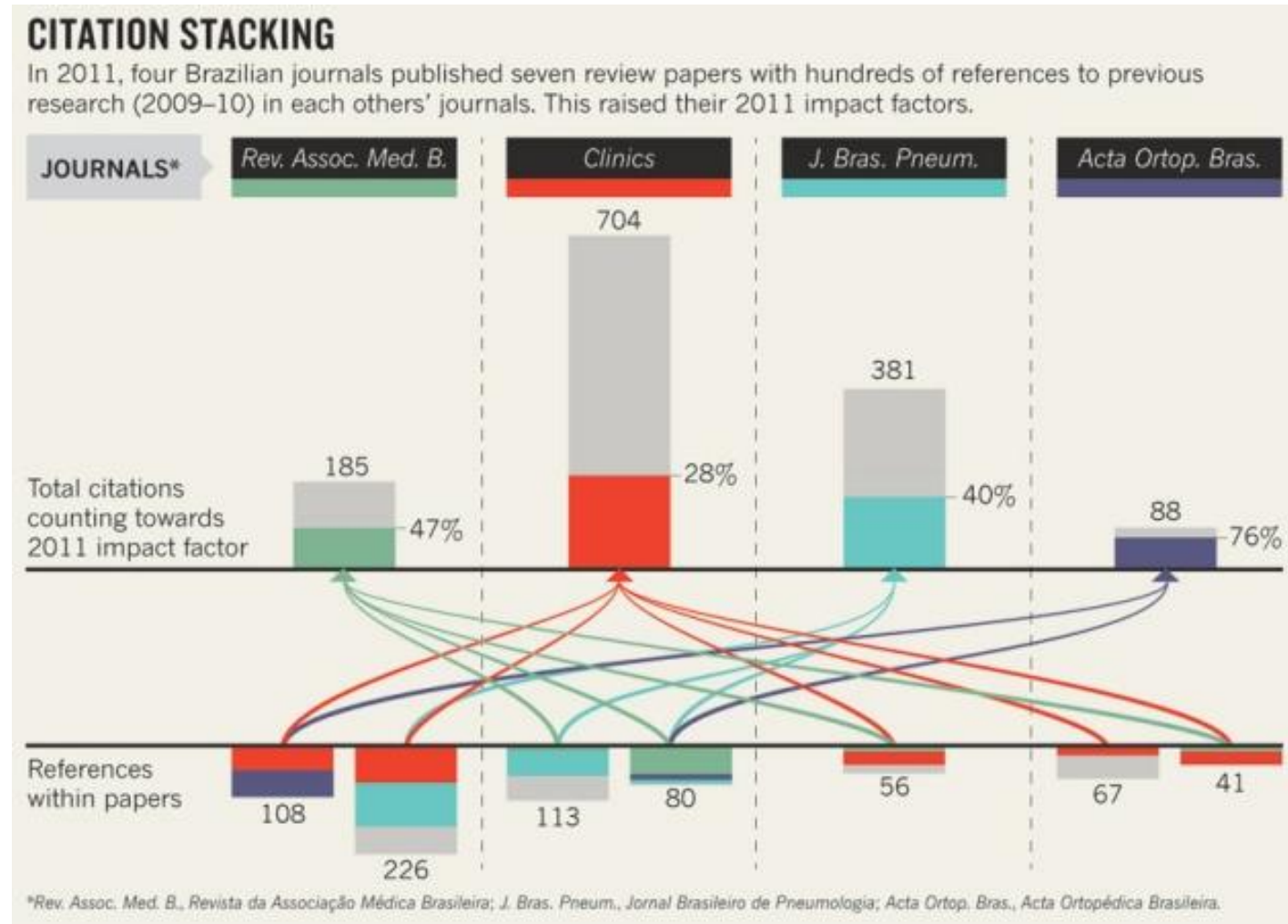
<http://www.nature.com/news/1-500-scientists-lift-the-lid-on-reproducibility-1.19970>

## WHAT FACTORS CONTRIBUTE TO IRREPRODUCIBLE RESEARCH?

Many top-rated factors relate to intense competition and time pressure.



# Use and abuse of metrics: from self-citation to citation cartels to citation stacking ...

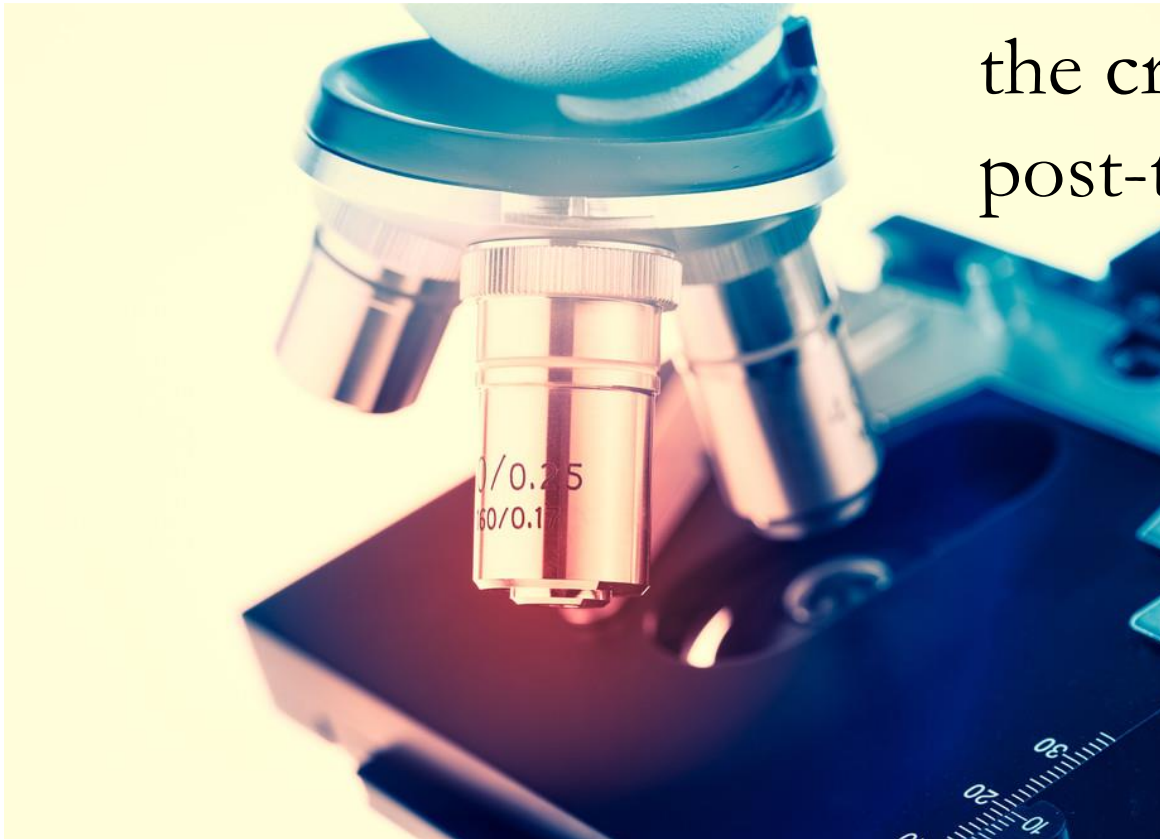


Richard Van Noorden, 2017, Brazilian citation scheme outed. Thomson Reuters suspends journals from its rankings for 'citation stacking'. Nature, 27 August 2013

## Science in crisis: from the sugar scam to Brexit, our faith in experts is fading

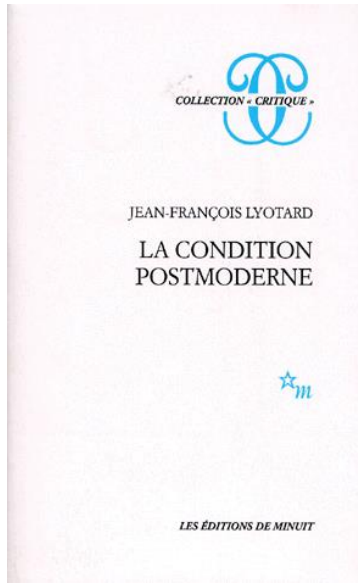
September 27, 2016 4:43pm AEST

A summary of  
the crisis versus  
post-truth nexus

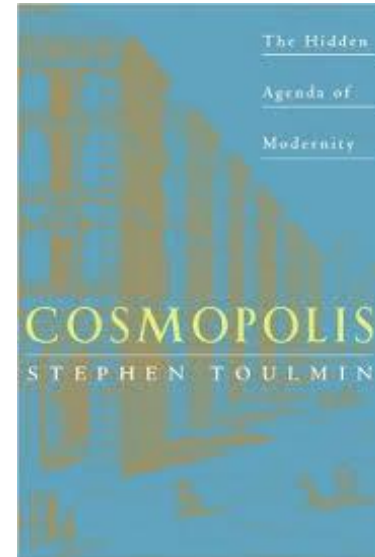




## Thesis 2: Likewise in crisis is democracy which has with science a legitimacy arrangement



Jean-  
François  
Lyotard



Stephen Toulmin

➔ today's post-BREXIT, post-Trump, post-truth brouhaha, the demise of expertise ...

**Thesis 3:** Science and its institutions are committed to the status quo & attempt to evade a critical reflection with:

Denial

Dismissal

Diversion

Displacement

*Economy and Society* Volume 41 Number 1 February 2012: 107–125

**Uncomfortable knowledge:  
the social construction of  
ignorance in science and  
environmental policy  
discourses**

Steve Rayner

# Denial (1)

OECD publishing

Please cite this paper as:

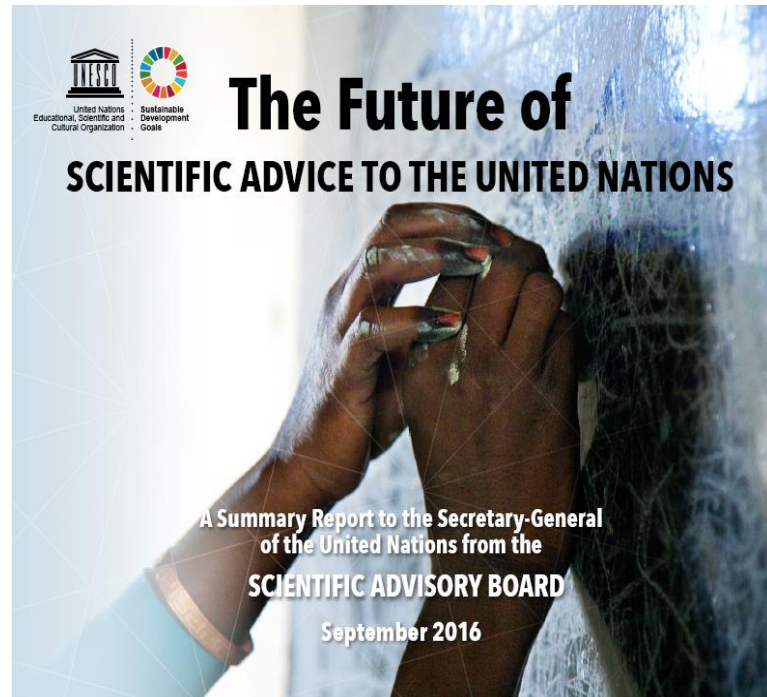
OECD (2015), "Scientific Advice for Policy Making: The Role and Responsibility of Expert Bodies and Individual Scientists", *OECD Science, Technology and Industry Policy Papers*, No. 21, OECD Publishing, Paris.  
<http://dx.doi.org/10.1787/5js3311jcpwb-en>

OECD Science, Technology and Industry  
Policy Papers No. 21

## Scientific Advice for Policy Making

THE ROLE AND RESPONSIBILITY OF EXPERT  
BODIES AND INDIVIDUAL SCIENTISTS

OECD



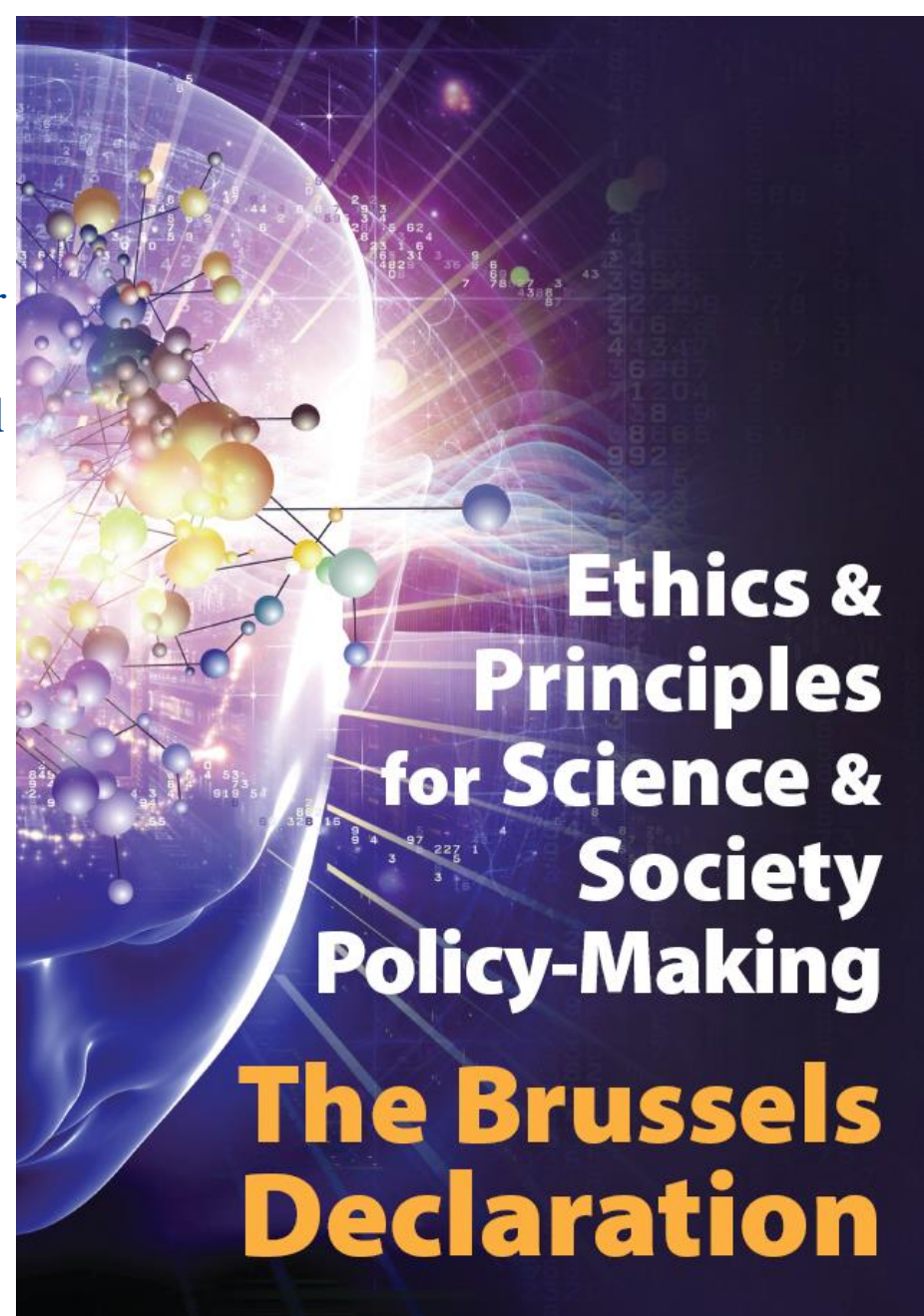
2015

2016

# Denial (2)

Adopted on 17th February, 2017, at symposium of American Association for the Advancement (AAAS) after 5 y gestation, hundreds of experts involved

- No crisis
- No effect of crisis on evidence based policy
- No asymmetries in the use and availability of evidence for policy (citizens same power as lobbyists)





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Original research article

# What is wrong with evidence based policy, and how can it be improved?

Denial (3)

Andrea Saltelli<sup>a,b,c,\*</sup>, Mario Giampietro<sup>a,c,d</sup>



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## Evidence-based medicine has been hijacked: a report to David Sackett

[John P.A. Ioannidis](#)  

Power asymmetries in the framing of issues;  
Instrumental use of quantification to obfuscate;  
➔ open the space of possible narratives and  
control their quality (Saltelli and Giampietro, 2017)

Evidence based medicine hijacked to serve  
corporate agendas. Meta-analyses and guidelines  
serving vested interests. “Under market pressure,  
clinical medicine has been transformed to finance-  
based medicine” (Ioannidis, 2016)



# Dismissal? We can solve it!

nature.com > nature human behaviour > perspectives > article

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nature  
human behaviour



Altmetric: 1,978 Views: 40,227

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Perspective | [OPEN](#)

## A manifesto for reproducible science

Marcus R. Munafò , Brian A. Nosek, Dorothy V. M. Bishop, Katherine S. Button, Christopher D. Chambers, Nathalie Percie du Sert, Uri Simonsohn, Eric-Jan Wagenmakers, Jennifer J. Ware & John P. A. Ioannidis

*Nature Human Behaviour* **1**,  
Article number: 0021 (2017)  
[doi:10.1038/s41562-016-0021](https://doi.org/10.1038/s41562-016-0021)

Published online: 10 January 2017

“[...] measures [to] improving the transparency, reproducibility and **efficiency** of scientific research”

# But ...can we do it from the inside?

TABLE 1. GROWING PERVERSE INCENTIVES IN ACADEMIA

<i>Incentive</i>	<i>Intended effect</i>	<i>Actual effect</i>
“Researchers rewarded for increased number of publications.”	“Improve research productivity,” provide a means of evaluating performance.	“Avalanche of” substandard, “incremental papers”; poor methods and increase in false discovery rates leading to a “natural selection of bad science” (Smaldino and McElreath, 2016); reduced quality of peer review
“Researchers rewarded for increased number of citations.”	Reward quality work that influences others.	Extended reference lists to inflate citations; reviewers request citation of their work through peer review
“Researchers rewarded for increased grant funding.”	“Ensure that research programs are funded, promote growth, generate overhead.”	Increased time writing proposals and less time gathering and thinking about data. Overselling positive results and downplay of negative results.
Increase PhD student productivity	Higher school ranking and more prestige of program.	Lower standards and create oversupply of PhDs. Postdocs often required for entry-level academic positions, and PhDs hired for work MS students used to do.
Reduced teaching load for research-active faculty	Necessary to pursue additional competitive grants.	Increased demand for untenured, adjunct faculty to teach classes.
“Teachers rewarded for increased student evaluation scores.”	“Improved accountability; ensure customer satisfaction.”	Reduced course work, grade inflation.
“Teachers rewarded for increased student test scores.”	“Improve teacher effectiveness.”	“Teaching to the tests; emphasis on short-term learning.”
“Departments rewarded for increasing U.S. News ranking.”	“Stronger departments.”	Extensive efforts to reverse engineer, game, and cheat rankings.
“Departments rewarded for increasing numbers of BS, MS, and PhD degrees granted.”	“Promote efficiency; stop students from being trapped in degree programs; impress the state legislature.”	“Class sizes increase; entrance requirements” decrease; reduce graduation requirements.
“Departments rewarded for increasing student credit/contact hours (SCH).”	“The university’s teaching mission is fulfilled.”	“SCH-maximization games are played”: duplication of classes, competition for service courses.

Modified from Regehr (pers. comm., 2015) with permission.

Academic Research in the 21st Century: Maintaining Scientific Integrity in a Climate of Perverse Incentives and Hyper-competition, Marc A. Edwards and Siddhartha Roy, ENVIRONMENTAL ENGINEERING SCIENCE, 34(1), 2017



---

## *Incentive*

---

“Researchers rewarded for increased number of publications.”

*Intended effect*

---

“Improve research productivity,”  
provide a means of evaluating  
performance.

*Actual effect*

---

“Avalanche of” substandard, “incremental papers”; poor methods and increase in false discovery rates leading to a “natural selection of bad science” (Smaldino and McElreath, 2016); reduced quality of peer review

Academic Research in the 21st Century:  
Maintaining Scientific Integrity in a  
Climate of Perverse Incentives and  
Hyper-competition, Marc A. Edwards  
and Siddhartha Roy,  
ENVIRONMENTAL ENGINEERING  
SCIENCE, 34(1), 2017

## Dismissal (2)

A different theory is:  
'too many scientists  
=  
many bad papers'  
==> stick to the good  
(high H) scientists!



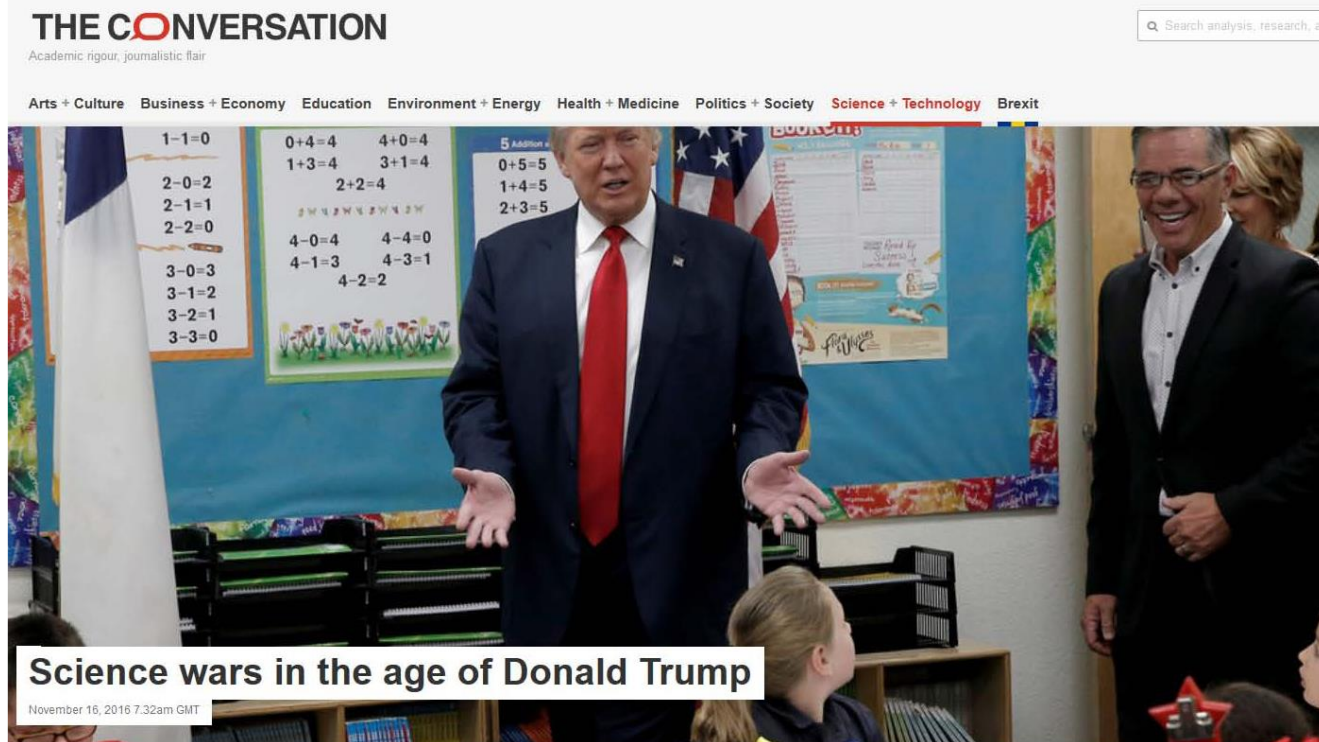
But: "studies by highly cited authors ... were not more affected by bias than average"

<https://phys.org/news/2017-03-scientific-bias-problems.html>

<http://www.pnas.org/content/114/14/3714.abstract>

Daniele Fanelli, Rodrigo Costas, and John P. A. Ioannidis, Meta-assessment of bias in science, PNAS vol. 114 no. 14, 3714–3719

Diversion (There is a problem, and this is due to an ongoing war on science between the educated liberal left and the ignorant conservative right)



<https://theconversation.com/science-wars-in-the-age-of-donald-trump-67594>

# Displacement (This is the post-truth era)

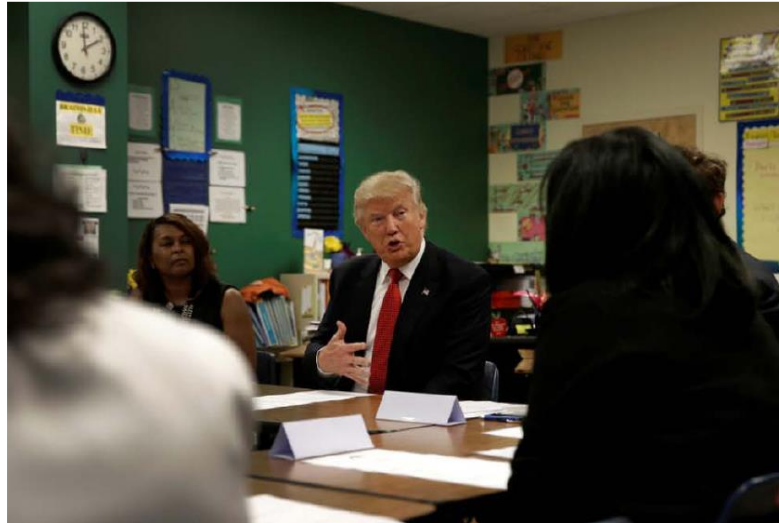
## THE CONVERSATION

Academic rigour, journalistic flair

Arts + Culture Business + Economy Education Environment + Energy Health + Medicine Politics + Society **Science + Technology** Brexit

### To tackle the post-truth world, science must reform itself

January 27, 2017 7:33am GMT



#### Authors



#### Andrea Saltelli

Adjunct professor, University of Bergen



#### Silvio Oscar Funtowicz

Adjunct Professor Centre for the Study of the Sciences and the Humanities, University of Bergen

<https://theconversation.com/to-tackle-the-post-truth-world-science-must-reform-itself-70455>

# Displacement (This is the post-truth era)



## Authors



**Andrea Saltelli**  
Adjunct professor, University of Bergen



**Silvio Oscar Funtowicz**  
Adjunct Professor Centre for the Study of the Sciences and the Humanities, University of Bergen

Was policy based on evidence before Brexit and Trump?

“Trump is not science’s problem. Science is.”

<https://theconversation.com/to-tackle-the-post-truth-world-science-must-reform-itself-70455>

Thesis 4: Solutions aren't  
forthcoming anytime soon



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## **The natural selection of bad science**

Paul E. Smaldino, Richard McElreath

Published 21 September 2016. DOI: 10.1098/rsos.160384



“Poor research design ... encourage false-positive findings. Such poor methods persist despite perennial calls for improvement, suggesting that they result from something more than just misunderstanding”

Smaldino PE, McElreath R., 2016 The natural selection of bad science. R. Soc. open sci. 3: 160384. <http://dx.doi.org/10.1098/rsos.160384>



“Some normative methods of analysis have almost certainly been selected to further publication instead of discovery”

Smaldino PE, McElreath R., 2016 The natural selection of bad science. R. Soc. open sci. 3: 160384. <http://dx.doi.org/10.1098/rsos.160384>

“[via a meta analysis & modelling exercise we study] the logical consequences of structural incentives[ and how] competing laboratories investigate novel or previously published hypotheses using culturally transmitted research methods.”

Smaldino PE, McElreath R., 2016 The natural selection of bad science. R. Soc. open sci. 3: 160384. <http://dx.doi.org/10.1098/rsos.160384>

“As in the real world, successful labs produce more ‘progeny,’ [...] Selection for high output leads to poorer methods and increasingly high false discovery rates [...] Improving the quality of research requires change at the institutional level.”

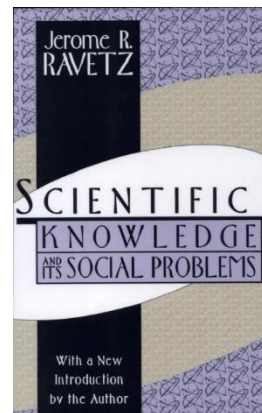
Smaldino PE, McElreath R., 2016 The natural selection of bad science. R. Soc. open sci. 3: 160384. <http://dx.doi.org/10.1098/rsos.160384>

p.22-23; Two separate factors are necessary for the achievement of worthwhile scientific results:

a community of scholars with a shared knowledge of the standards of quality appropriate for their work and a shared commitment to enforce those standards by the informal sanctions the community possesses;

and individuals whose personal integrity sets standards at least as high as those required by their community.

Ravetz, J., 1971, Scientific Knowledge and its Social Problems, Oxford University Press, p.22.



Jerome R.  
Ravetz

Puzzling futures

# Thesis 5: Areas of resistance and ‘Reformation’ where science and society work together – emergence of a new polity of science, including citizen scientists and scientist–citizens



Jeffrey Beall



Lois Gibbs



Timothy Gowers



Marc Edwards

<http://scholarlyoa.com/2015/01/02/bealls-list-of-predatory-publishers-2015/#more-4719>

<https://www.bu.edu/lovecanal/canal/>

<http://journals.plos.org/plosone/article?id=10.1371%2Fjournal.pone.0127502>

[https://en.wikipedia.org/wiki/Flint\\_water\\_crisis](https://en.wikipedia.org/wiki/Flint_water_crisis); <http://flintwaterstudy.org/>;

<http://www.nytimes.com/2016/08/21/magazine/flints-water-crisis-and-the-troublemaker-scientist.html>

# Has science become an endeavor where attempts to fix a diseased system lead you to disgrace?



Jeffrey Beall

**CENSORED**



<http://www.npr.org/sections/thetwo-way/2013/05/15/184233141/publisher-threatens-librarian-with-1-billion-lawsuit>

<http://retractionwatch.com/2017/01/17/bealls-list-potential-predatory-publishers-go-dark/>



# Who pays to fight bad science?



John and Laura  
Arnold



Brian Nosek, the  
Reproducibility  
Project.



John Ioannidis,  
Meta-research  
innovation  
centre at  
Stanford



Ben  
Goldacre,  
alltrials.net



Gary Taubes, The  
case against sugar

# Who pays to fight bad science?

Bill & Melinda Gates



“Bill & Melinda Gates [...] the world’s biggest source of charitable money for scientific endeavours (\$4bn a year) ...

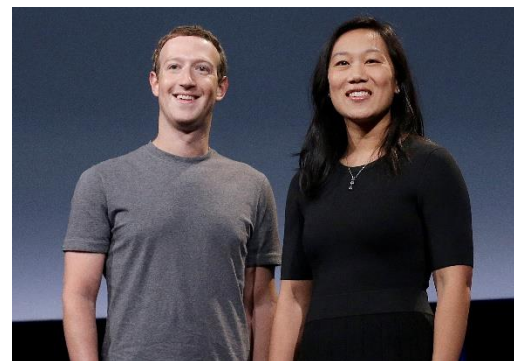
[its research] must be freely available to all [and] will pay the cost of putting such research in one particular repository of freely available papers

[they] offered the publishers of *Science*, \$100,000 to make papers published this year about Gates-sponsored research free to read from the beginning.

<http://www.economist.com/news/science-and-technology/21719438-about-change-findings-medical-research-are-disseminated-too>

# Who pays to fight bad science?

“Mark Zuckerberg & Priscilla Chan will disburse \$50m to 47 local scientists on condition they made their work available as preprints.”



Mark Zuckerberg & Priscilla Chan

<http://www.economist.com/news/science-and-technology/21719438-about-change-findings-medical-research-are-disseminated-too>

# Rare examples of a different culture



Yoshiki Sasai

<http://www.nature.com/news/stem-cell-pioneer-blamed-media-bashing-in-suicide-note-1.15715>

Could the  
reformation offer  
inspiration?



Martin Luther



Johann Tetzel

Science exhibits ‘indulgencies–like’ pathologies:

Predatory (or simply greedy) publishers, scandals in peer review, in trade of authorship, in faulty policy prescriptions), domination of corporate interests in science ...



Martin Luther



Johann Tetzel

1. Science is in a deep existential crisis which has ethical, epistemological, methodological and even metaphysical dimensions
2. Likewise democracy which has with science a legitimacy arrangement
3. Science and its institutions are committed to the status quo & attempt to evade a critical reflection
4. Solutions aren't forthcoming anytime soon
5. There are few areas of 'Reformation' where science and society work together





# END

Twitter:  
@andreasaltelli

## Scientists' march on Washington is a bad idea – here's why

March 8, 2017 6.54pm AEDT

Author



**Andrea Saltelli**

Adjunct Professor Centre for the Study of the Sciences and the Humanities, University of Bergen, University of Bergen



Some questioned the concept of the Women's March on Washington. Now scientists will march against Donald Trump. Is that a good idea?

# The Republic of Science: Its Political and Economic Theory

## Michael Polanyi

[This article originally appeared in *Minerva* 1:54-74, 1962 and is put on WWW with kind permission from Kluwer Academic Publishers (<http://www.wkap.nl>) and John C. Polanyi.]

### Polanyi's theses:

Science as a market driven by higher principles

...

Which feeds society's thirst for self improvement

...

Science as a community of practice capable of self-governance ...



Michal Polanyi

<https://theconversation.com/scientists-march-on-washington-is-a-bad-idea-heres-why-73305>

## Scientists' march on Washington is a bad idea – here's why

March 8, 2017 6:54pm AEDT



Some questioned the concept of the Women's March on Washington. Now scientists will march against Donald Trump. Is that a good idea?

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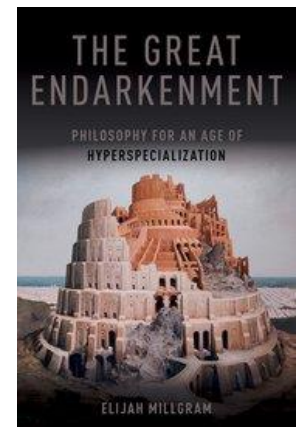
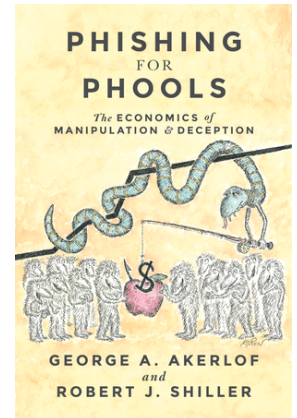
Today:

Science and innovation driven by imperfect markets

Society's self improvement likewise entrusted to market forces

Science divided by practices (methodological aliens)

<https://theconversation.com/scientists-march-on-washington-is-a-bad-idea-heres-why-73305>



## Scientists' march on Washington is a bad idea – here's why

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“Our activism would be better inspired by the radical 1970s-era movements that sought to change the world by changing first science itself. They sought to provide scientific knowledge and technical expertise to local populations and minority communities while giving those same groups a chance to shape the questions asked of science.”

<https://theconversation.com/scientists-march-on-washington-is-a-bad-idea-heres-why-73305>

On the march: the  
spirit of the time  
in the house of  
science





Source: The Conversation, <https://theconversation.com/scientists-march-on-washington-is-a-bad-idea-heres-why-73305>





# MARCH FOR SCIENCE

— EARTH DAY —

**APRIL 22, 2017**

#MarchforScience

[Join the movement](#)





The March for Science is the first step of a global movement to defend the vital role science plays in our health, safety, economies, and governments.

**It's time to get off the sidelines and make a difference.**

[Register to attend your local march](#)



The March for Science champions robustly funded and publicly communicated science as a pillar of human freedom and prosperity. We unite as a diverse, nonpartisan group to call for science that upholds the common good and for political leaders and policy makers to enact evidence based policies in the public interest.



The March for Science is a celebration of science. It's not only about scientists and politicians; it is about the very real role that science plays in each of our lives and the need to respect and encourage research that gives us insight into the world.



Nevertheless, the march has generated a great deal of conversation around whether or not scientists should involve themselves in politics. In the face of an alarming trend toward discrediting scientific consensus and restricting scientific discovery, we might ask instead: can we afford not to speak out in its defense?

There is no Planet B. Join the #MarchForScience.

What if even she is wrong?



Series over series where lab-  
based forensics (science)  
adjudicates cases ...

... but forensics [as well as  
medicine, biology, economics,  
health, nutrition ...] has  
produced serious misdiagnoses



National Academy of Sciences (NAS) report “Strengthening Forensic Science in the United States: A Path Forward”,  
<https://www.ncjrs.gov/pdffiles1/nij/grants/228091.pdf>