Why Science Is Not Necessarily Self-Correcting

Sooner or later, if something is wrong, a replication effort will show it to be wrong and the scientific record will be corrected.



Sooner or later, if something is wrong, a replication effort will show it to be wrong and the scientific record will be corrected.



Sooner or later, if something is wrong, a replication effort will show it to be wrong and the scientific record will be corrected.





Sooner or later, if something is wrong, a replication effort will show it to be wrong and the scientific record will be corrected.

> Raw data and Code is not available even destroyed Low Reproducibility

Surprising effects and Statistical Significance Unlikely effects and Massaged Statistics

#### Low Replicability





Low credibility

Even worse, we just don't know what is true and what is not!

#### A short stop on statistical power



#### A short stop on statistical power



#### But progress is made!

Maybe we are not doing science in the most efficient way

How many **correct** results are there in comparison with incorrect results?

Maybe we attribute big macro indexes to micro results

Poor return of investment

For sure we are not, inadequate power...

For each real effect we have many incorrect ones.

Leap of attribution

Maybe investing in medicine is not so good as inverting in Climate Change?

# Discovery and replication

Researchers use strategies to maximize publications at the cost credibility

Replication '*was*' not rewarded and regarded as futile effort for '*idealess envious*' researchers

Replication is a fundamental piece for selfcorrection

Change the focus from *'finding'* something novel to discovering the truth

Many samples are better than a big sample when I am looking for a significant result, but not when I am looking for the truth... Questionable research practices.

The Rules of the Game Called Psychological Science Bakker et al. 2012

Particularly if conceptual replications are *tuned* to replicate the result

'Each year, thousands of undergraduate projects are completed as part of the educational experience[...] they provide a good test of the replicability of established findings'

Harnessing the Undiscovered Resource of Student Research Projects

Grahe et al. 2012

### **Replication effort**



Discovery results	Replication results		
	Correct	Wrong	Not obtained
Correct (true positive) Wrong (false positive)	Optimal:≤1%* Self-correcting:≤1%*	False nonreplication: <<1%* Perpetuated fallacy: 2%*	Unconfirmed genuine discovery: 43%** Unchallenged fallacy: 53%**

Does not include publication biases, according to Ioannidis (2005) it can go up to 95%

Same group replications replications  $\approx$  confirmation bias (*p*-hacking) Conceptual replications  $\approx$  confirmation bias (*p*-hacking) Allegiance bias  $\approx$  followers of the theory

#### Impediments to self-correction

Selected references Impediments Publication bias Ferguson & Brannick (2012); Shadish et al. (1989) Other selective reporting bias (analysis and outcomes) Flexibility in data collection and analysis Simmons et al. (2011); Wagenmakers et al. (2012); Misreporting of results Bakker & Wicherts (2011) Fiedler (2011) Voodoo correlations Fabricated results Fanneli (2009) Other questionable research practices John et al. (2012) Francis (2012b); Ioannidis & Trikalinos (2007) Excess significance bias (may reflect any of the above) Underpowered studies Maxwell (2004) No replication work done—especially direct replication by Makel et al. (2012) independent investigators Underestimation of the replication crisis Pashler & Harris (2012) Editorial bias against replication research Neuliep & Crandall (1990) Reviewer bias against replication research Neuliep & Crandall (1993) Data, analyses, protocols not publicly available Alsheikh-Ali et al. (2011); Wicherts, Borsboom, Kats, & Molenaar(2006)

Table 2. A List of Described Impediments to Self-Correction in Science With Reference to Psychological Science

Classic publication bias considers that there are specific well-delineated studies with clear protocols, data, and analyses that disappear completely in a file drawer. In psychological science, as well as in other scientific fields, a study may be poorly defined and no protocol may exist. Investigators may continue adding and melding data, analyses, and subanalyses until something significant and publishable emerges.

### Impediments and problems

Proper replication is insufficient in the presence of publication bias

Lack of open data, code and protocols

Scarce multicenter studies with many participants

Undervalued by community

Individual data is very valuable for meta analysis

# Incentives for replication and correcting wrong results

Revalue replication effort

Stop focusing on impact factor and number of publications Crowdsourcing

Preregistration

Massive replication by students

#### Problems with incentives

Top to bottom involvement *'Surprising'* results will happen less often

Replications are a game played by students Strictly follow registration/checklist and hide somewhere else Open data may promote data dredging Junk papers if everything is published with no review However, at the end of the day, no matter what changes are made, scientific credibility may not improve unless the pursuit of truth remains our main goal in our work as scientists. This is a most noble mission that needs to be continuously reasserted.