



How do researchers interpret the results of multiple experiments?

Olmo van den Akker, 14-03-2019

Introduction

“It is as necessary to be able to [do statistics] as it is to read and write”

Experiments 4, 5, and 6: The Experimental-Causal-Chain Approach

Because all variables were measured in Experiment 3, it is not possible to establish causality in our mediation, that is, we cannot definitively say that power drove the reported differences in unethical behavior. To address this inherent limitation and provide complementary evidence for the underlying role of power, Experiments 4, 5, and 6 used the experimental-causal-chain approach (Spencer et al., 2005). Experiment 4 manipulated social class and measured how it affects people’s sense of power. Experiments 5 and 6 manipulated power and examined its effects on unethical behavior that either benefited the self or others. If differences in power underlie our effects, manipulating power should lead to the same behavioral tendencies as measured by differences in social class.

Experiment 4: Manipulating Social Class

Experiment 4 manipulated social class and measured its impact on sense of power.

Method. One hundred fifty participants (79 female; $M_{age} = 21.15$, $SD = 2.82$) were randomly assigned to a three-cells design (status: high-social-class vs. low-social-class vs. baseline). Participants, mostly students from a large European metropolitan area,

Experiment 5: Manipulating Power

In Experiment 5, we directly manipulated power and expected that high power would increase self-beneficial unethical behavior, but low power would increase other-beneficial unethical behavior, similar to the behavioral tendencies triggered by differences in social class (Experiments 1 through 3).

Method. One hundred twenty-one participants (59 females; $M_{age} = 20.56$, $SD = 1.17$) were randomly assigned to a 3 (power: high vs. low vs. baseline) \times 2 (lie beneficiary: self vs. other) between-subjects design. Participants were students of a large Midwestern University participating in a lab study in exchange for \$12.

Power manipulation. Participants completed two independent tasks in the lab. In the first task, participants completed a power recall task (Galinsky et al., 2003) that has been widely used to elicit differences in feelings of power (for reviews, see Galinsky et al., 2015; Rucker et al., 2012). In the high-power condition, participants wrote about a time they had power. In the low-power condition, participants wrote about a time they lacked power. In the baseline condition, participants wrote about the last time they went to the grocery store.

Unethical behavior measure. Participants then completed a second task, portrayed as a decision-making task for the psychology department. They were presented with a series of three scenarios in

Nells

Smith et al. 1991

Jones et al. 1993

Smith et al. 1999

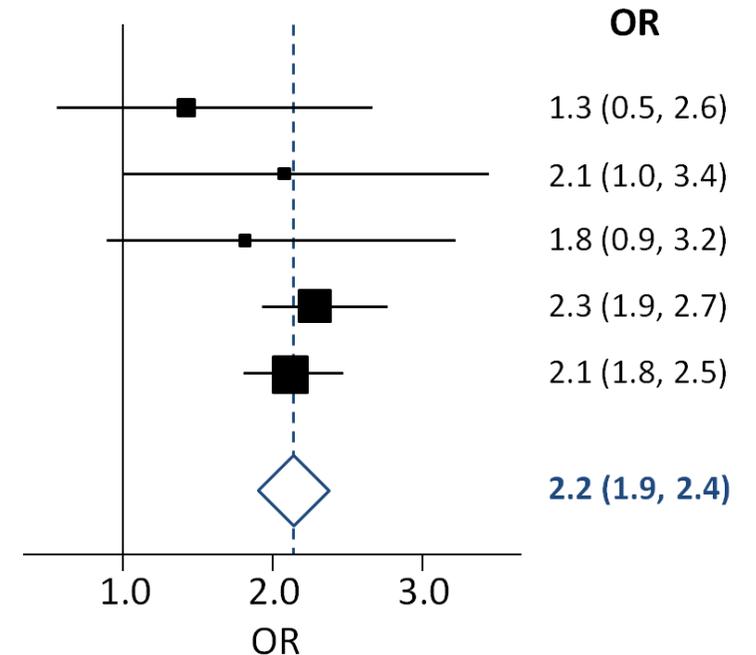
interpret

Ng et al. 2004

Chu et al. 2009

at the

Summary measure

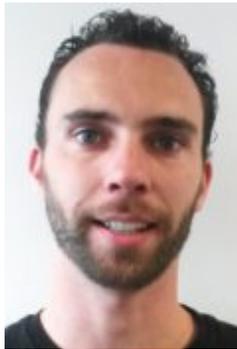


People

Experiment:



Follow-up analysis:



Supervision:



The Sample

Participants: researchers, editors, and reviewers in two fields of psychology

Social psychology (1126 papers):

- JPSP
- JESP
- PSPB
- EJSP



Experimental psychology (1323 papers):

- JEP: G
- JEP: HPP
- JEP: LMC
- QJEP
- C&E

Contacted:

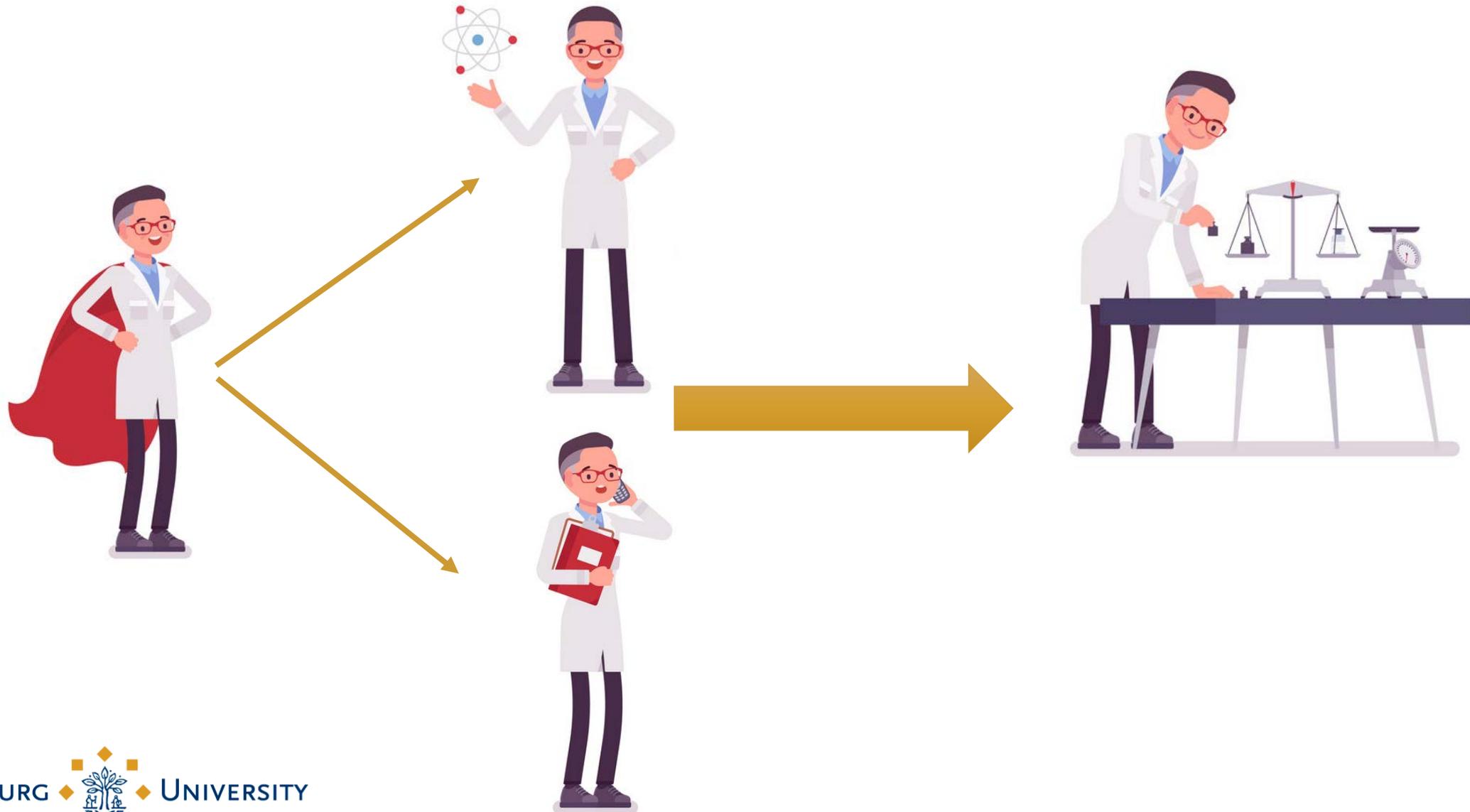
1810 authors

834 editors/reviewers

Participants:

505

The Experiment



The Experiment

Eureka!



The Experiment

Eureka!



The Experiment

Eureka!



The Experiment

Eureka!



The Experiment

Eureka!



The Experiment

Eureka!



Eureka!



The Experiment

Eureka!



Eureka!



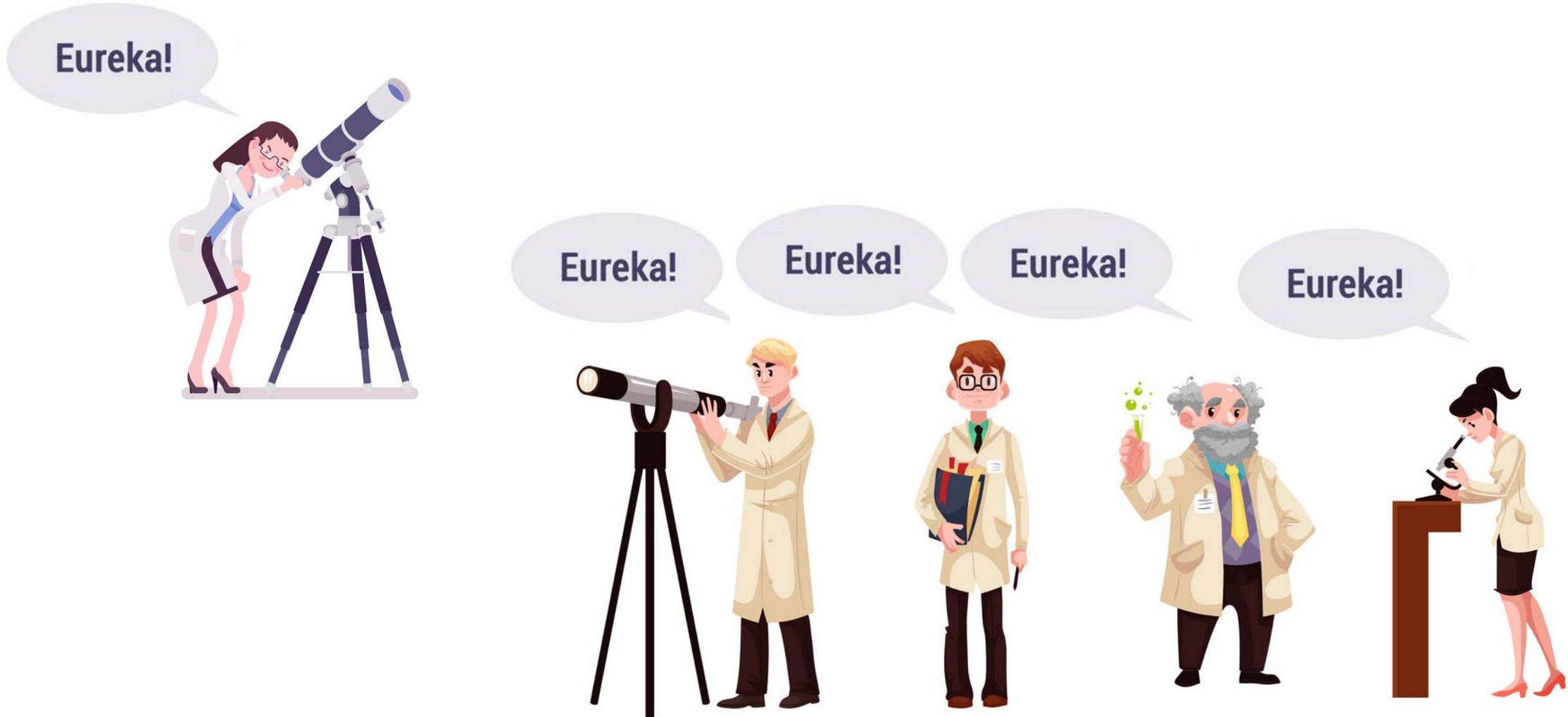
Eureka!



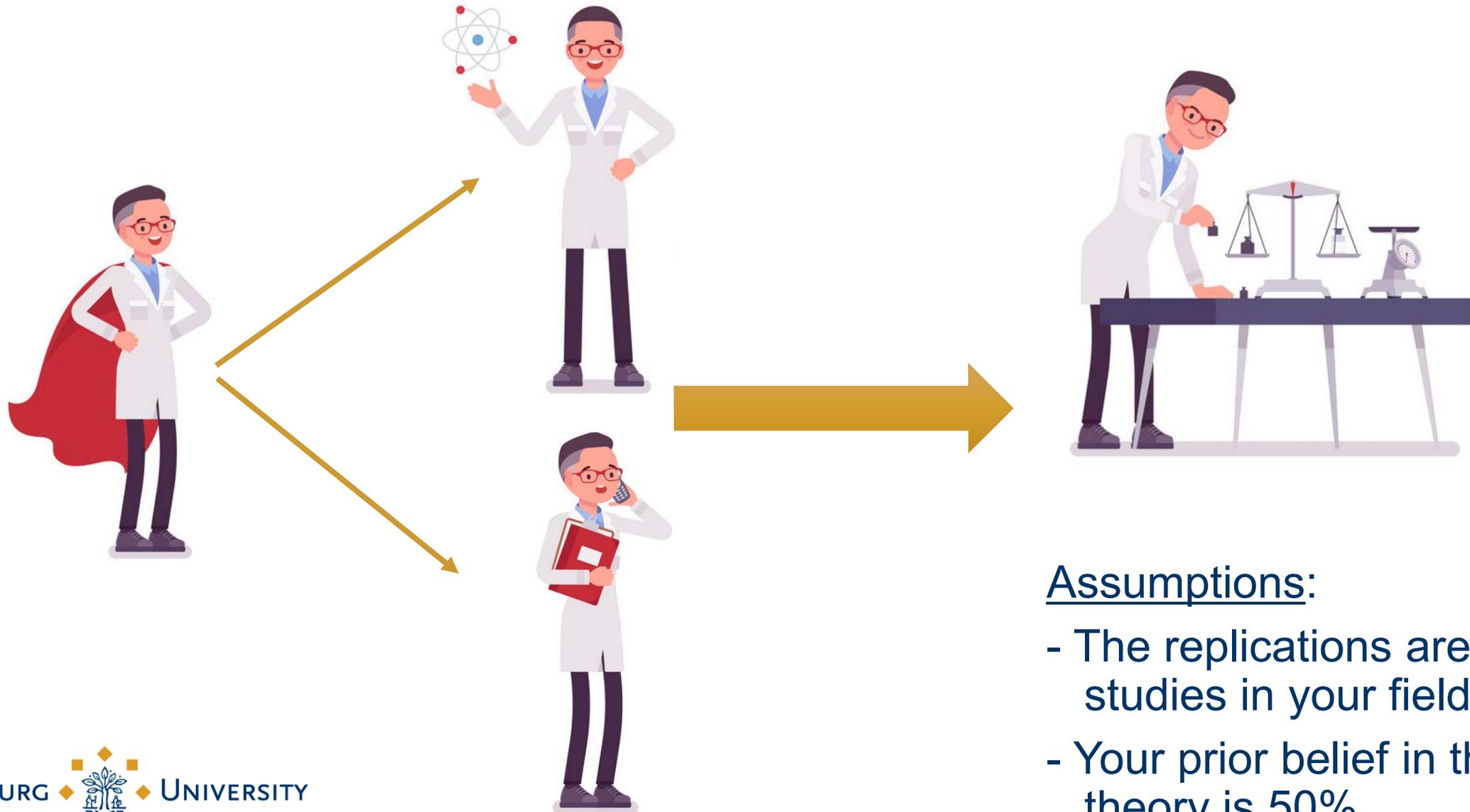
The Experiment



The Experiment



The Experiment



Assumptions:

- The replications are typical studies in your field
- Your prior belief in the theory is 50%

What are your beliefs?

Eureka!



Additional assumption:

- The power of all four studies is 0.50

1. 19%
2. 39%
3. 59%



Eureka!



What are your beliefs?

Eureka!



Additional assumption:

- The power of all four studies is 0.50

1. 19%
2. 39%
3. 59%



Eureka!



What are your beliefs?

Eureka!



Additional assumption:

- The power of all four studies is 0.50

Eureka!



Eureka!



1. 77%
2. 87%
3. 97%

What are your beliefs?

Eureka!



Additional assumption:

- The power of all four studies is 0.50

Eureka!



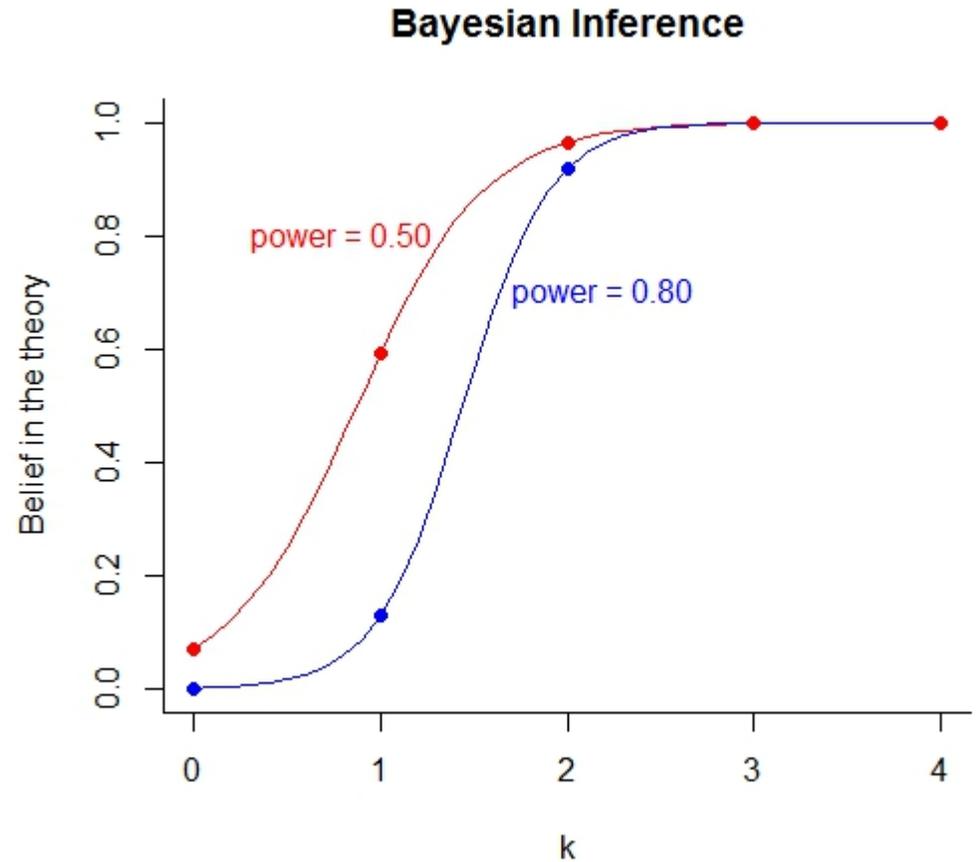
Eureka!



1. 77%
2. 87%
3. 97%

Bayesian Inference

$$p(H_A|data) = \frac{(1 - \beta)^k \beta^{(n-k)}}{(1 - \beta)^k \beta^{(n-k)} + \alpha^n (1 - \alpha)^{n-k}}$$



Main Hypotheses

1. There is a positive association between K and belief in the theory
2. Conceptual replications are valued more than direct replications.

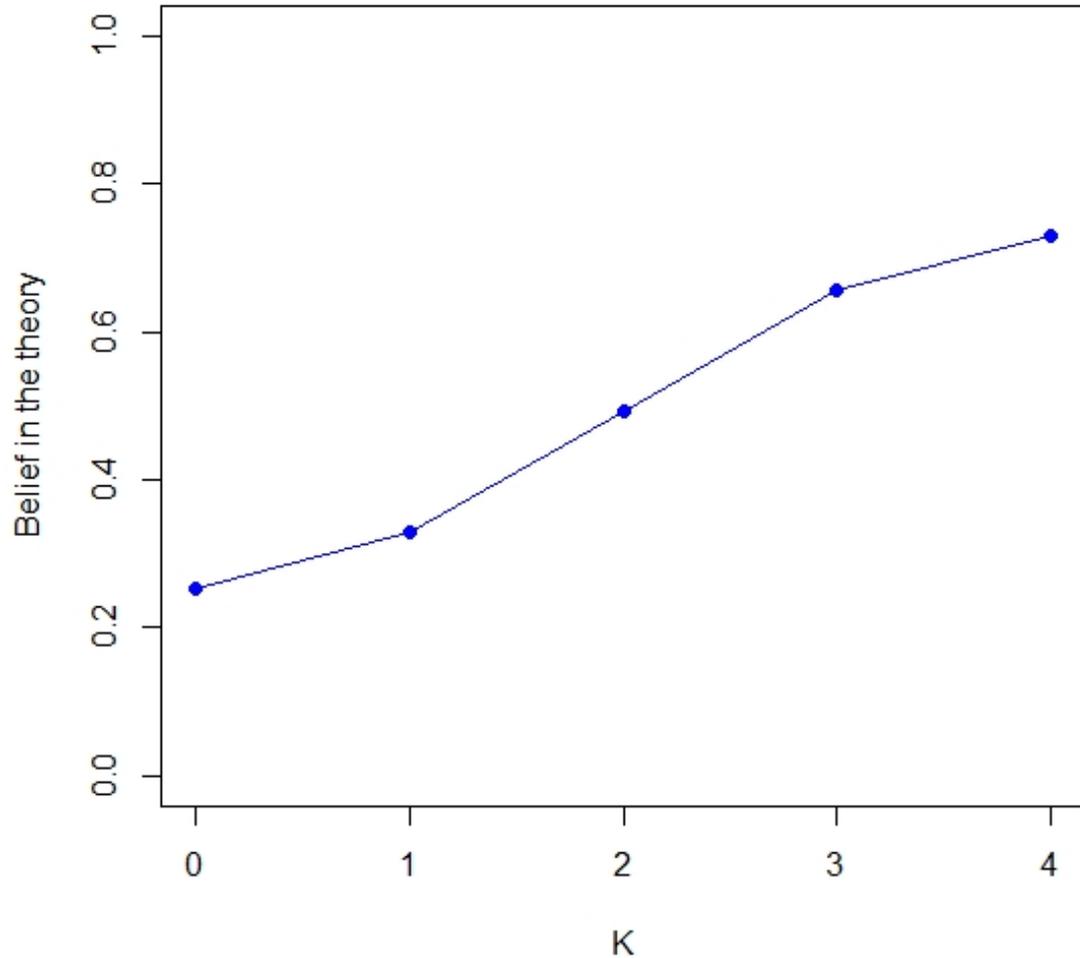


3. 'Researchers' differ from 'reviewers' in their propensity to submit (for researchers) or recommend to submit (for reviewers) the set of studies for publication



Main Results – Hypothesis 1

K vs. Belief in the theory

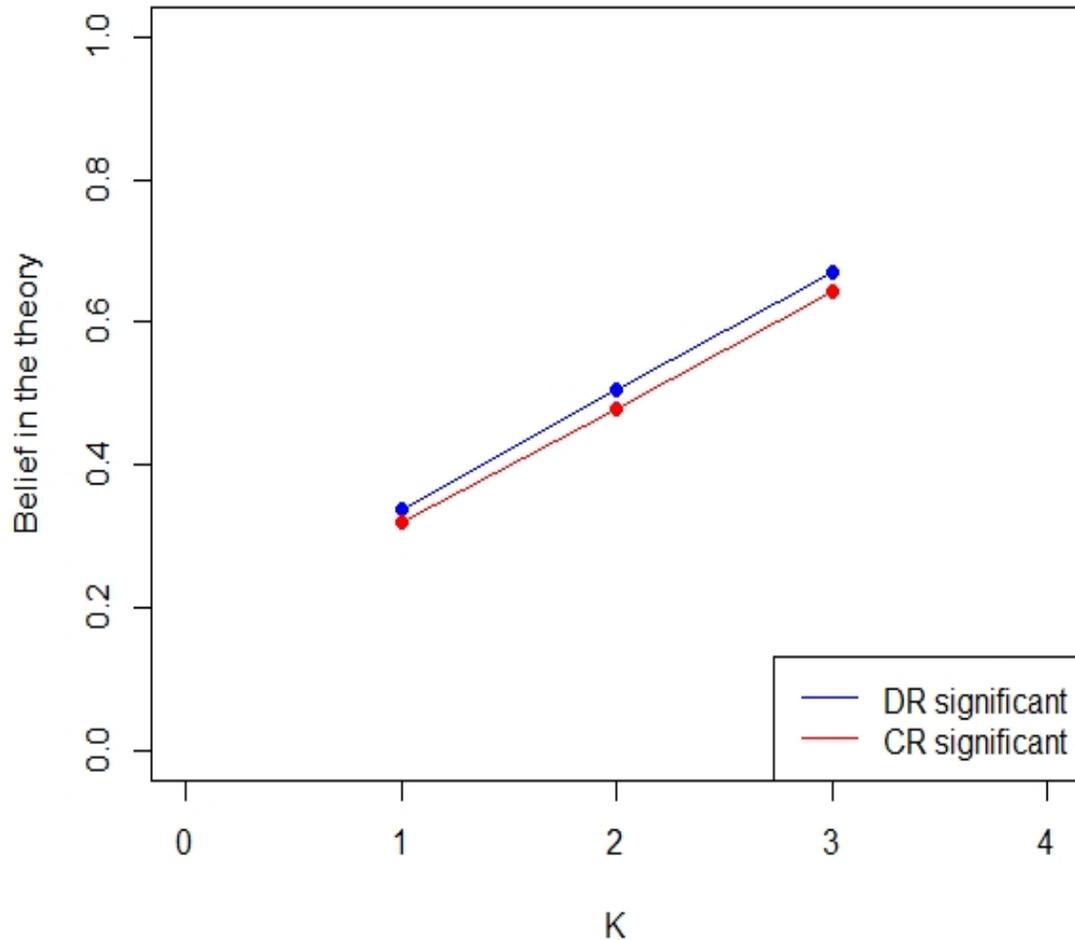


Finding 1:

There is a positive association between K and belief in the theory

Main Results – Hypothesis 2

K vs. Belief in the theory

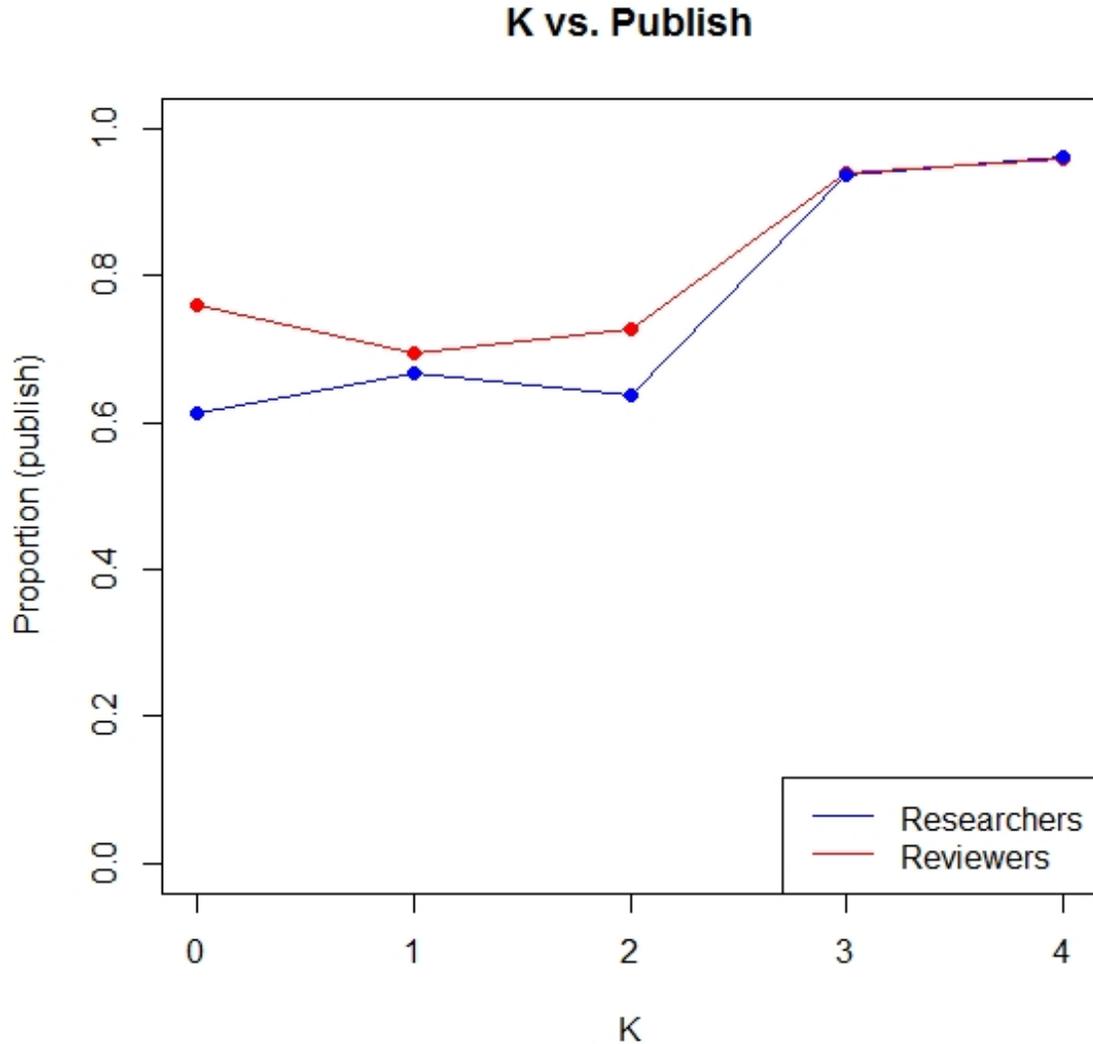


Finding 2:

Direct replications are valued (slightly) more than conceptual replications

Very small effect

Main results – Hypothesis 3



Finding 3:

There is no difference between researchers and reviewers in their desire to publish

Main Results

1. Positive association between K and belief in the theory

2. Direct replications are valued as much as conceptual replications

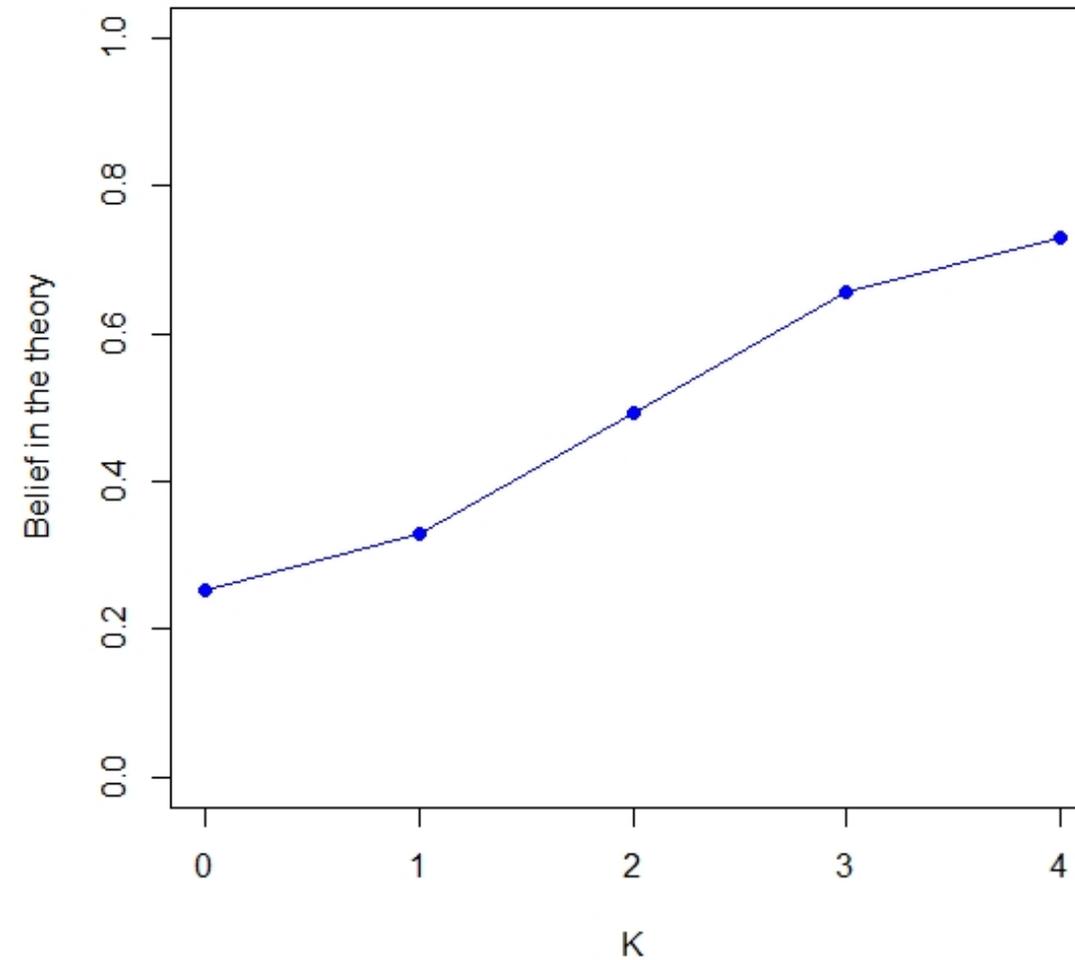


3. 'Researchers' do not differ from 'reviewers' in their propensity to submit or recommend the set of studies for publication



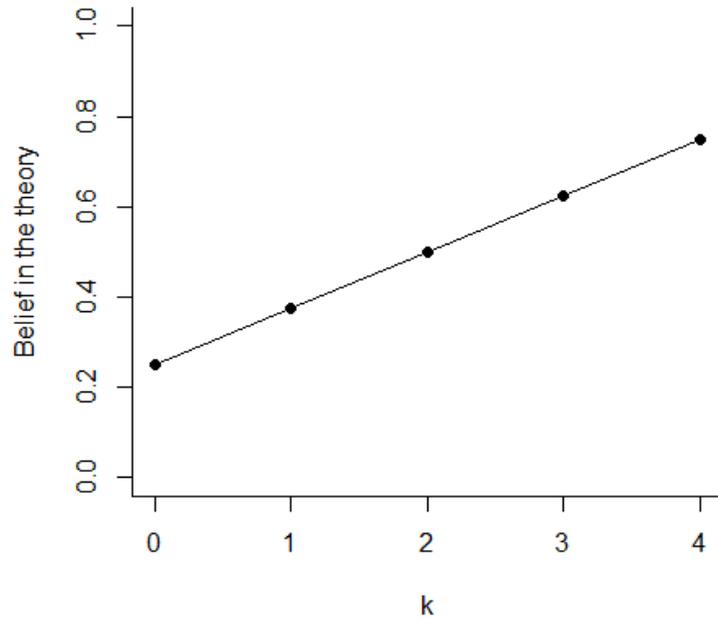
Main Results

K vs. Belief in the theory

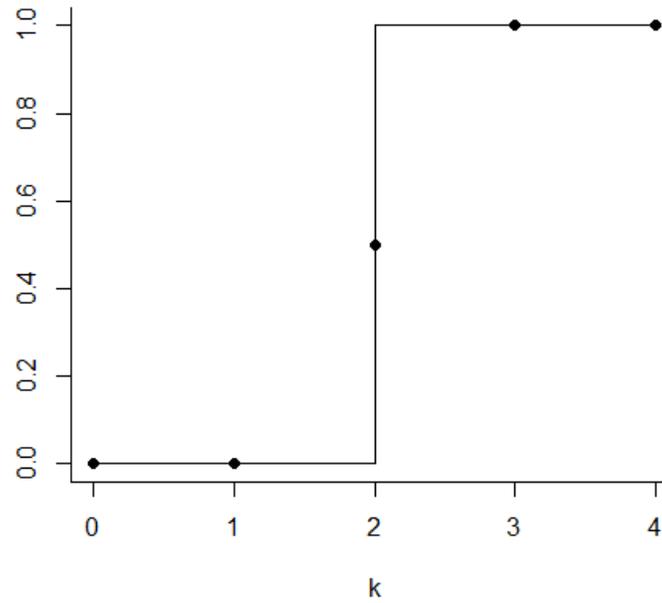


Other Heuristics

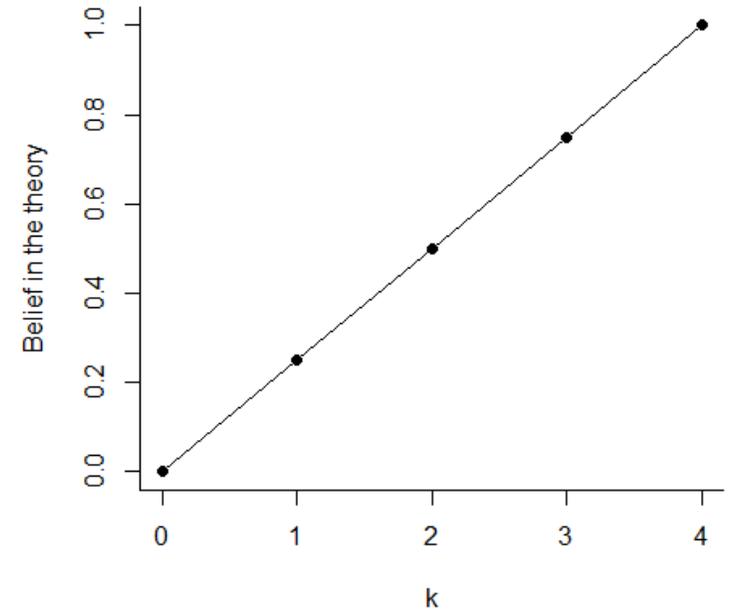
Averaging Prior Belief and Significance



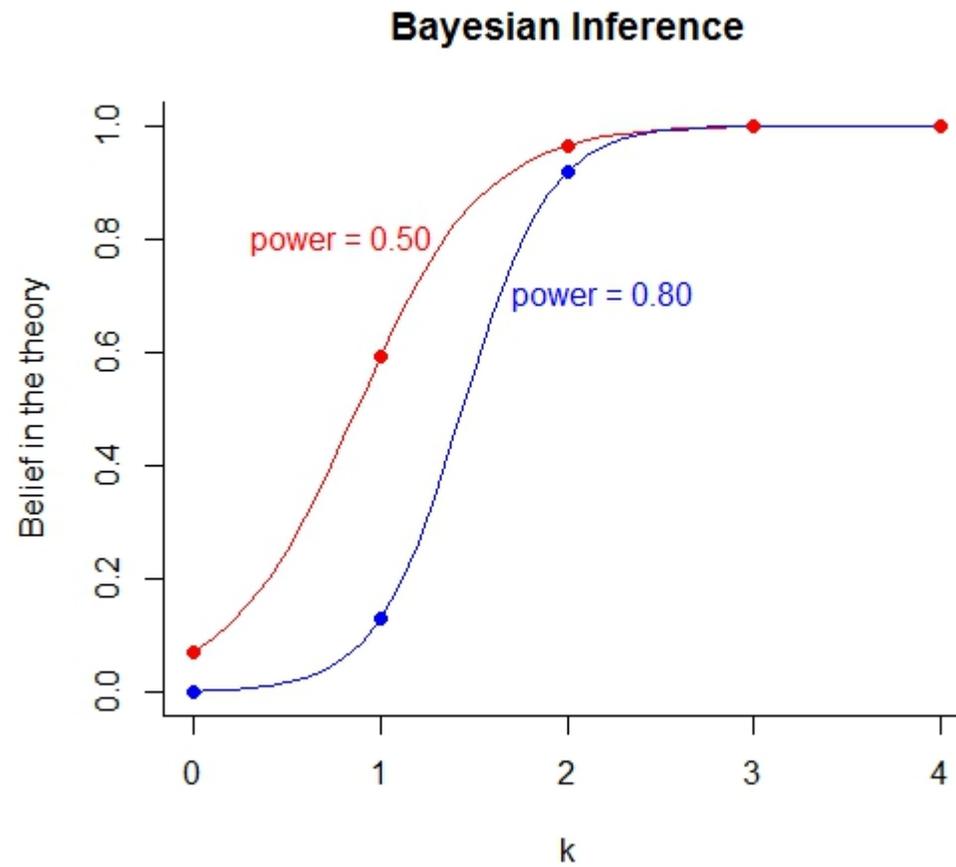
Deterministic Vote Counting



Proportional Vote Counting



The normative heuristic



A Bayesian Approach

$$P(H_1|X) = \frac{\frac{1}{4} * P(X|H_1)}{\frac{1}{4} * P(X|H_1) + \frac{1}{4} * P(X|H_2) + \frac{1}{4} * P(X|H_3) + \frac{1}{4} * P(X|H_4)}$$

where $P(X|H_i)$ is the likelihood of the data given heuristic i

Categorization

Strict:

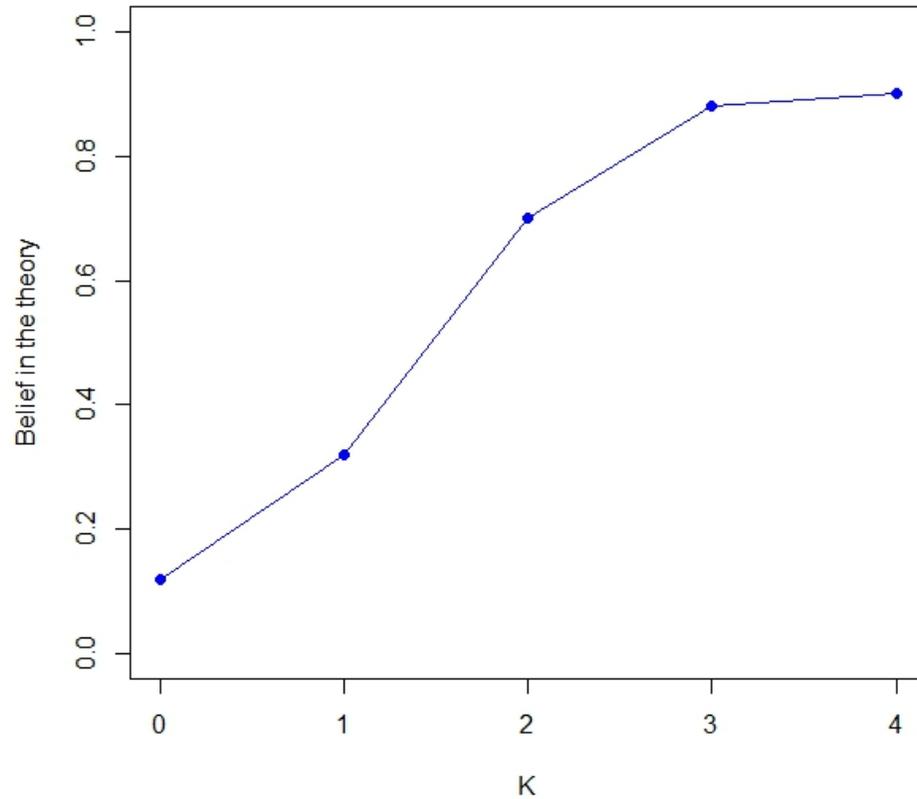
- 1) The heuristic should be more than three times as likely as the other heuristics combined (Bayes Factor > 3)
- 2) The heuristic should outperform a benchmark heuristic
($RMSE_{Heuristic} < RMSE_{Benchmark}$)

Lenient:

- 1) The heuristic should be more likely than the other heuristics
- 2) The heuristic should outperform a benchmark heuristic
($RMSE_{Heuristic} < RMSE_{Benchmark}$)

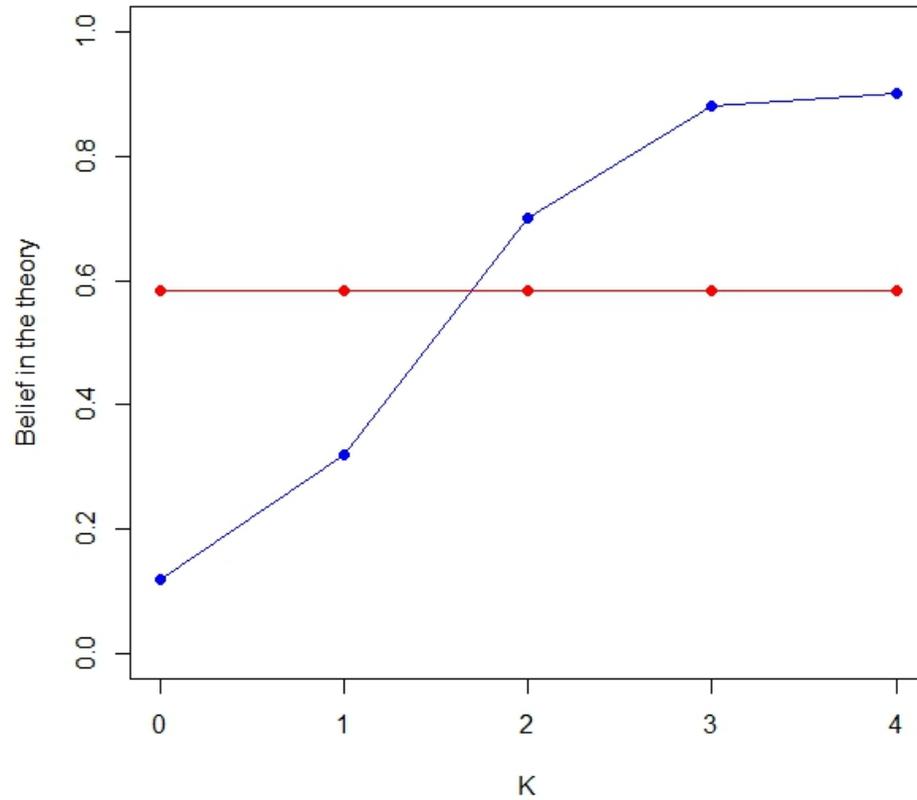
The Benchmark Heuristic

Belief in the theory Vs. K

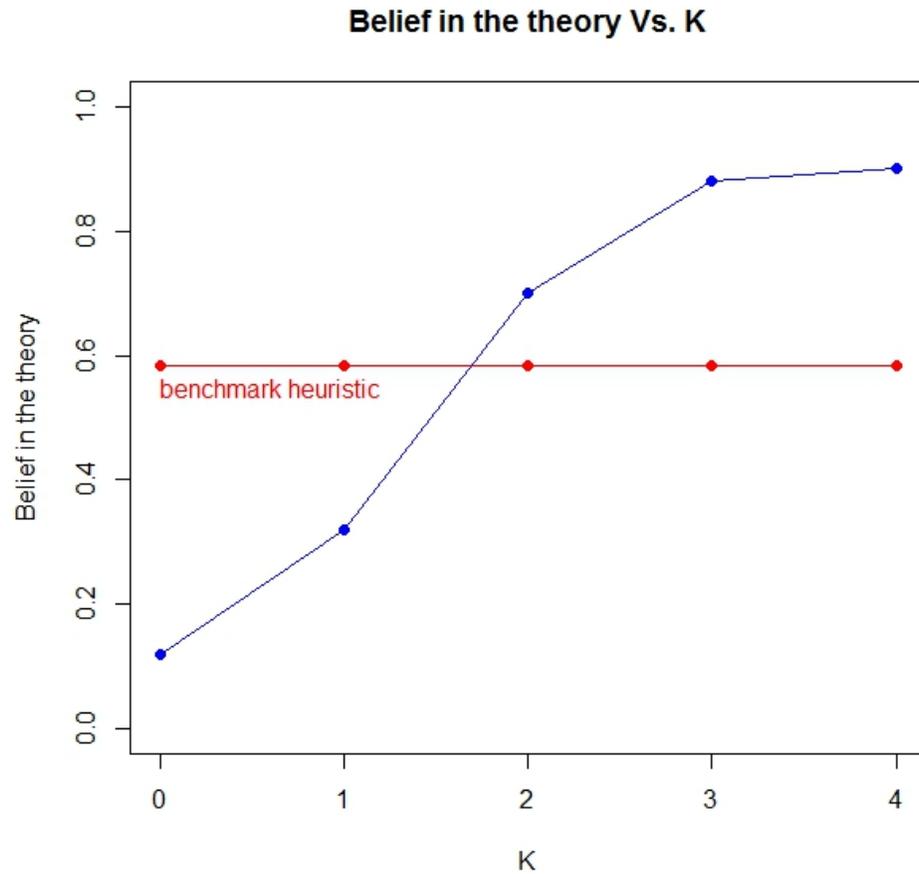


The Benchmark Heuristic

Belief in the theory Vs. K

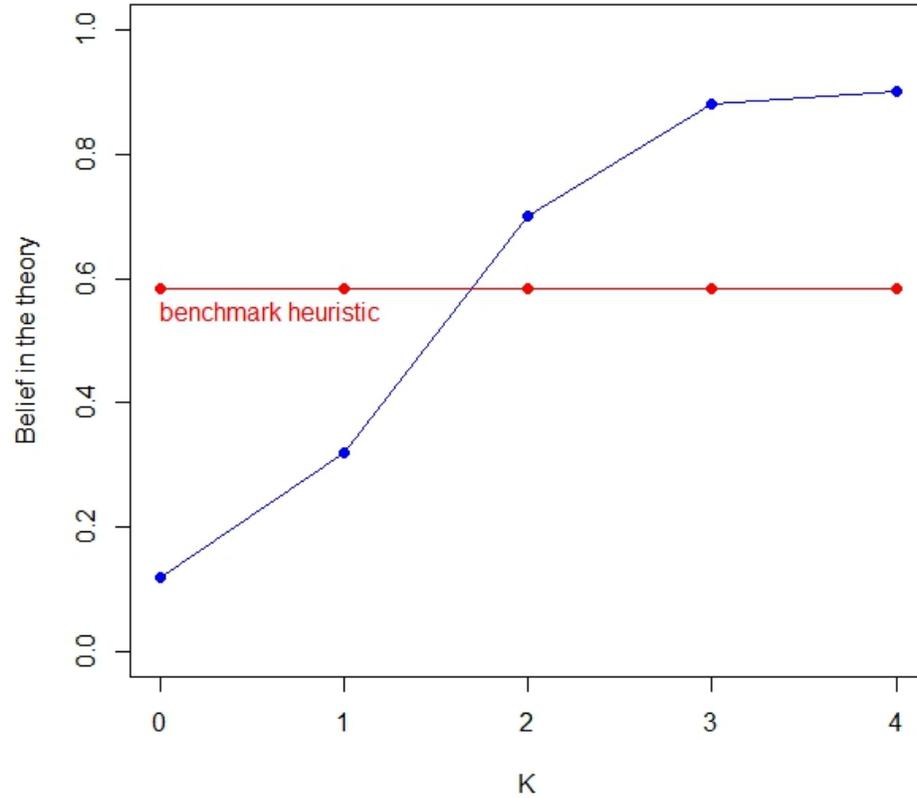


The Benchmark Heuristic

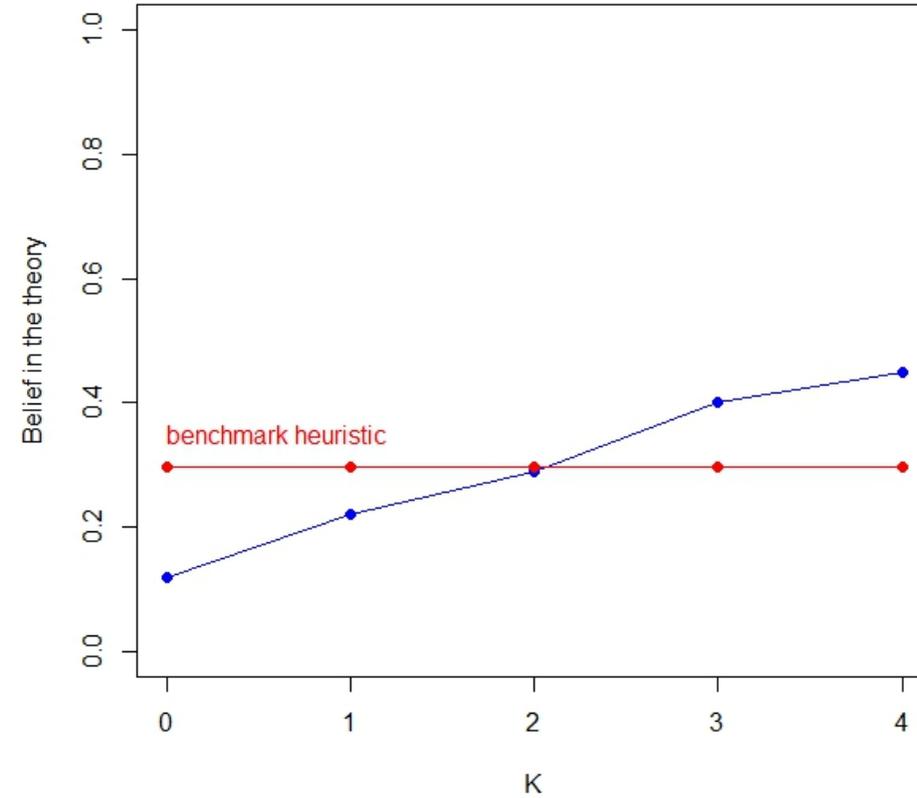


The Benchmark Heuristic

Belief in the theory Vs. K

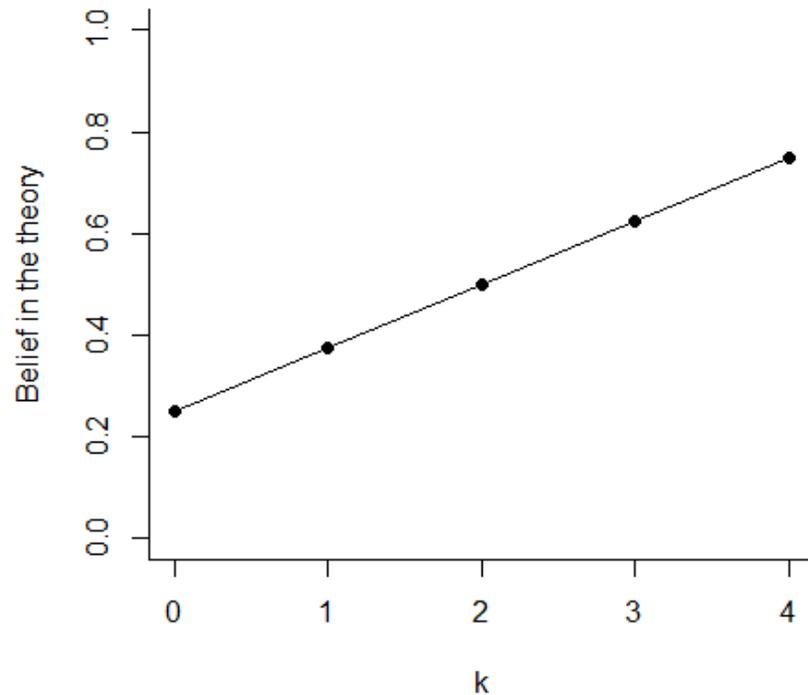


Belief in the theory Vs. K

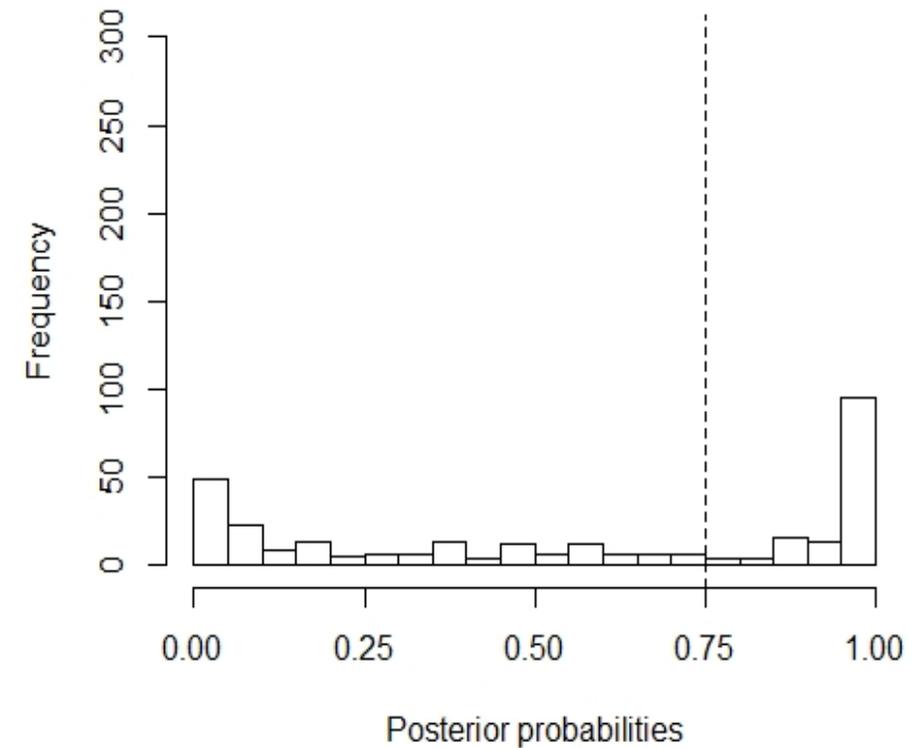


The Posterior Probabilities

Averaging Prior Belief and Significance

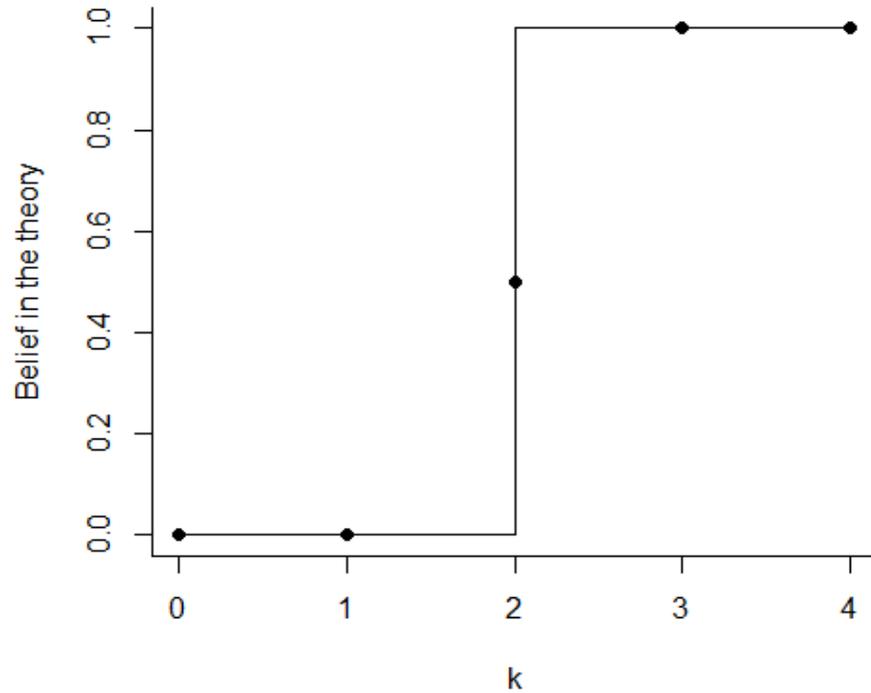


Averaging Prior Belief and Significance

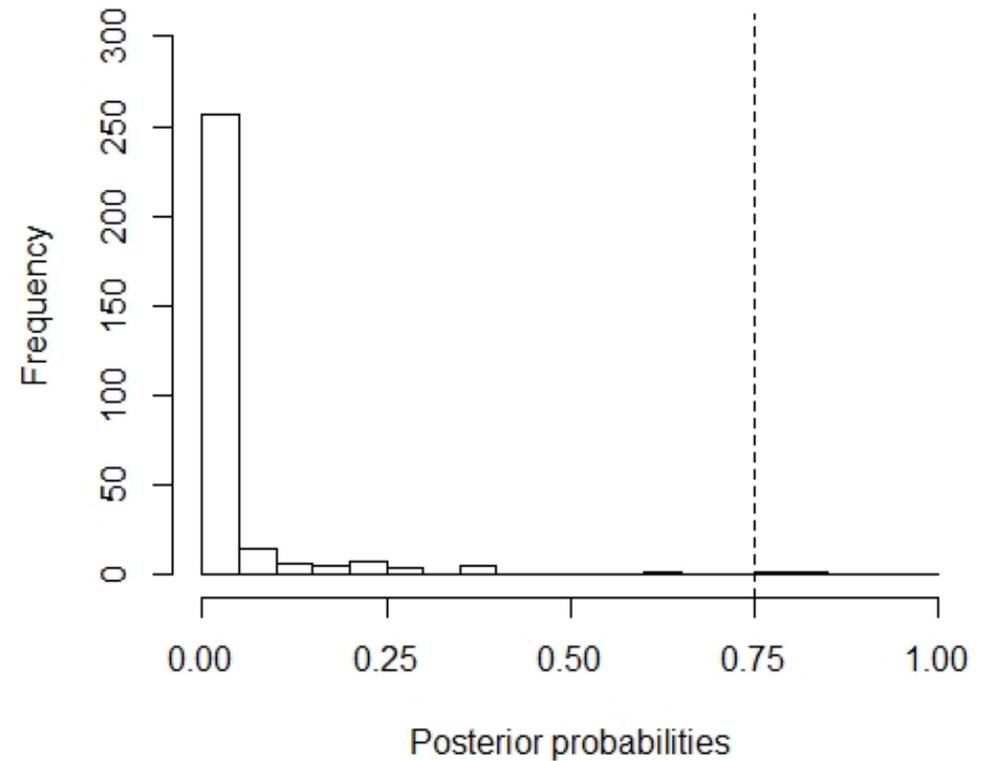


The Posterior Probabilities

Deterministic Vote Counting

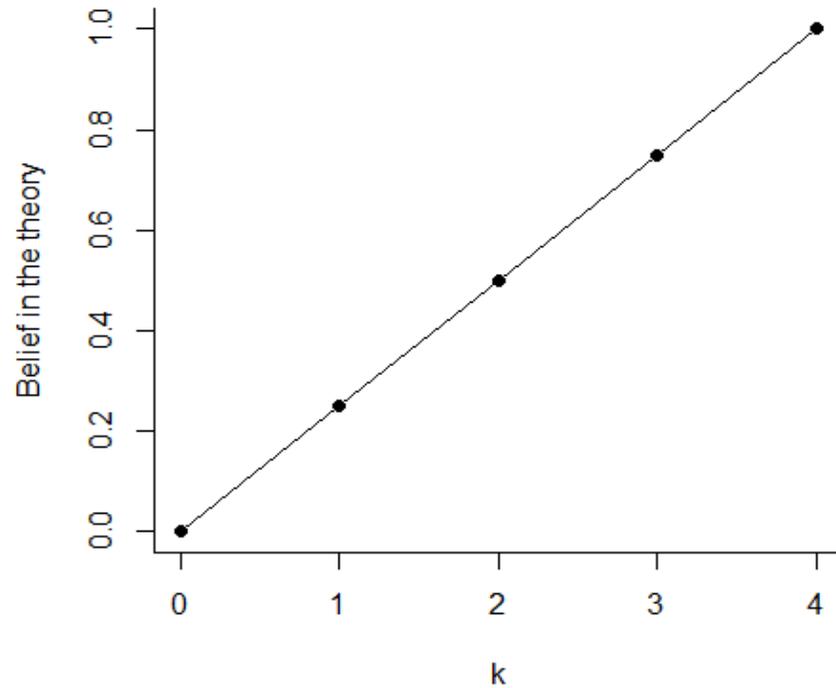


Deterministic Vote Counting

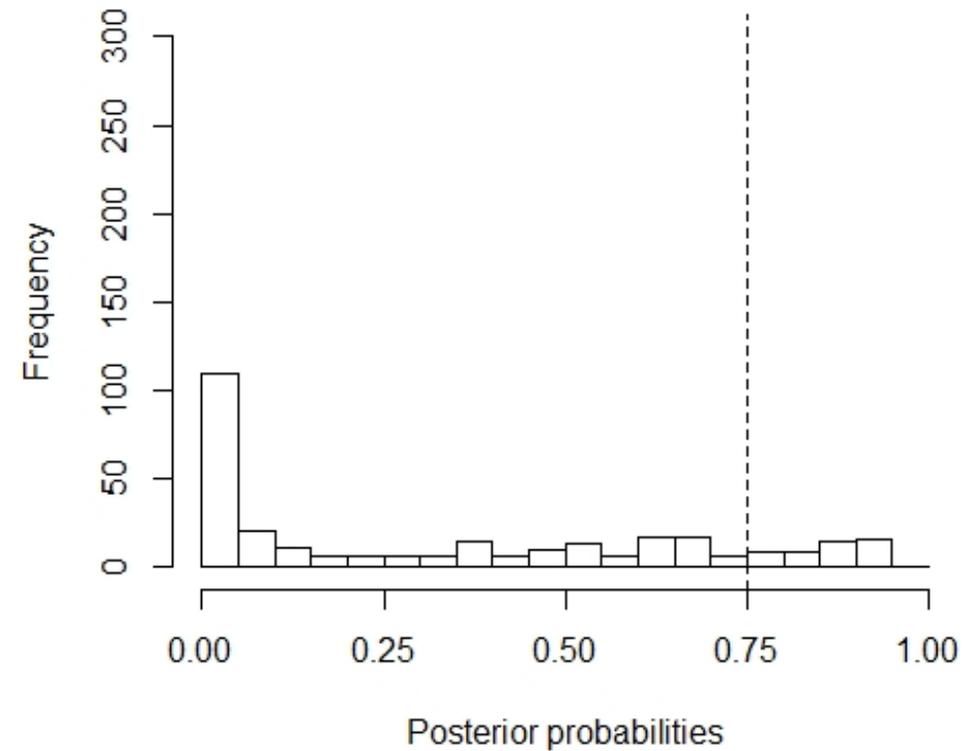


The Posterior Probabilities

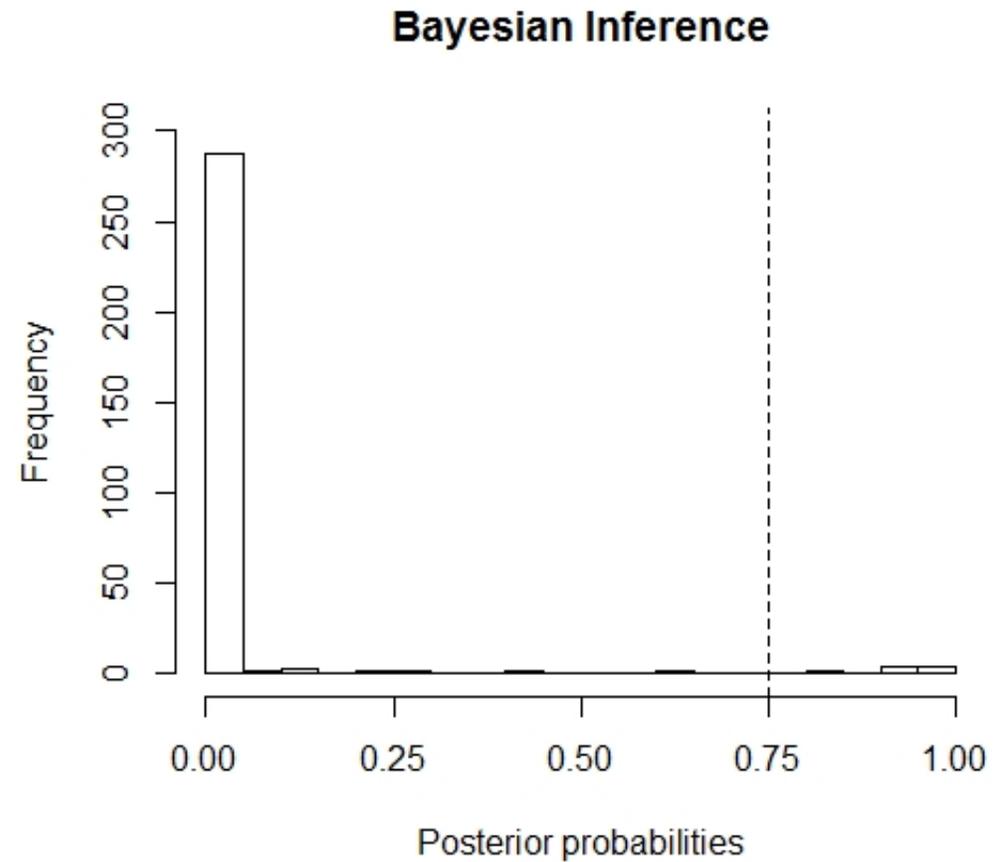
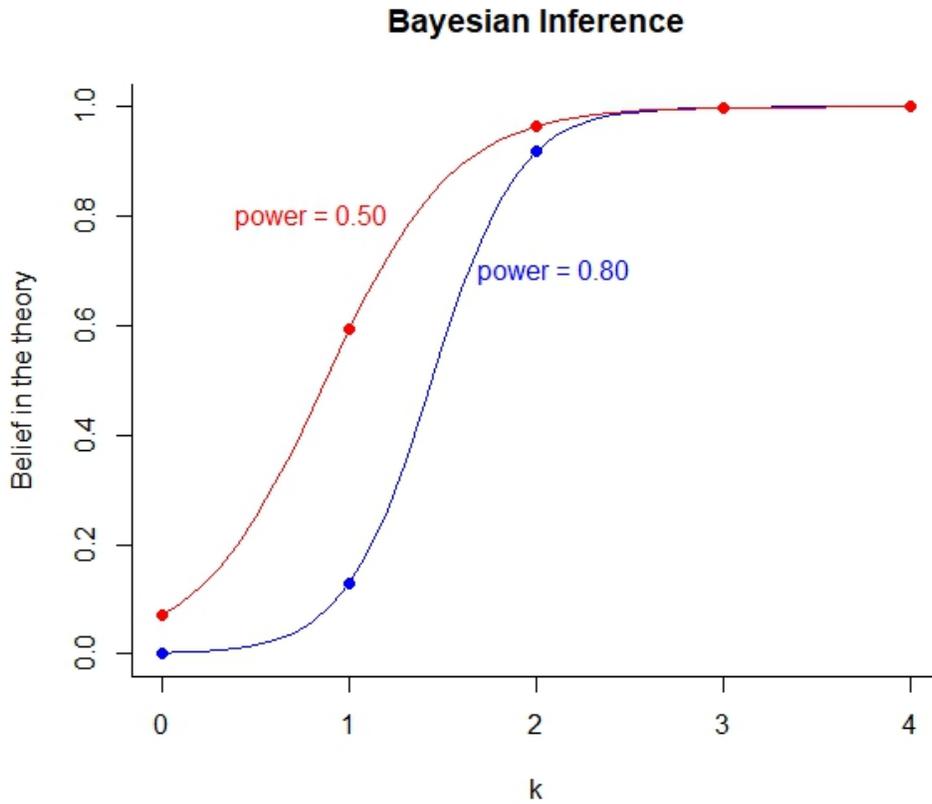
Proportional Vote Counting



Proportional Vote Counting

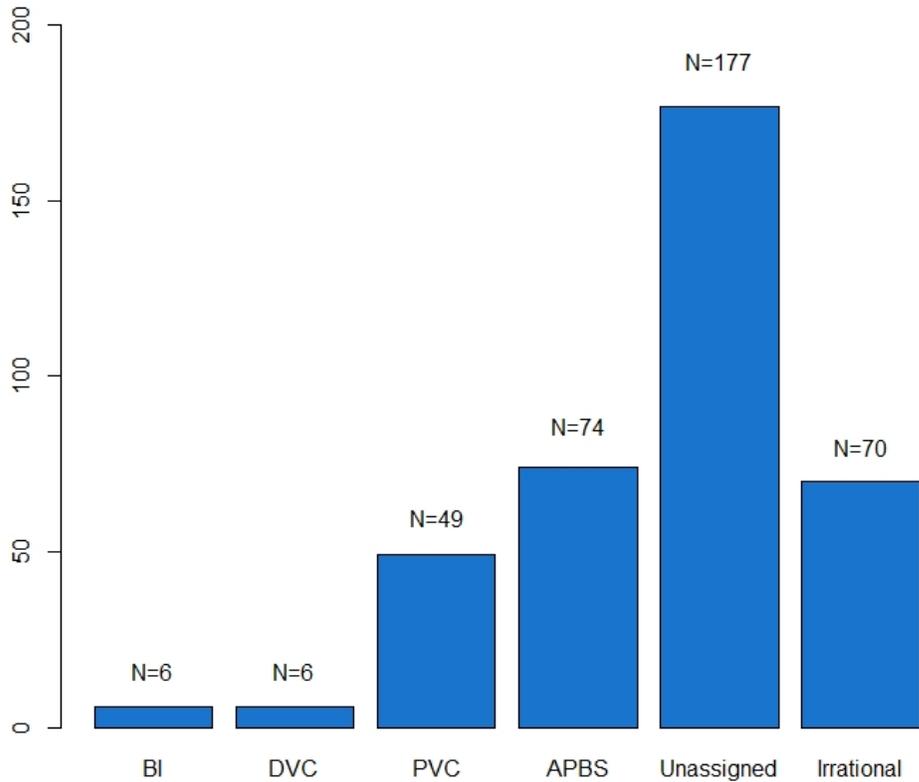


The Posterior Probabilities

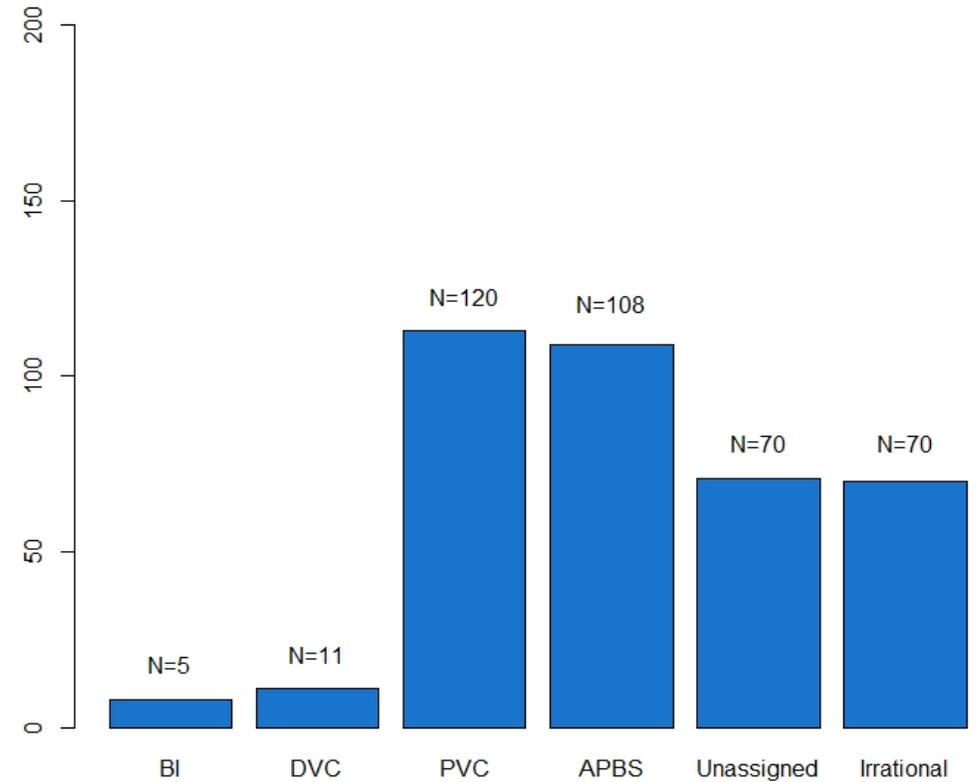


The Results

Strict categorization of researchers into heuristic categories



Lenient categorization of researchers into heuristic categories

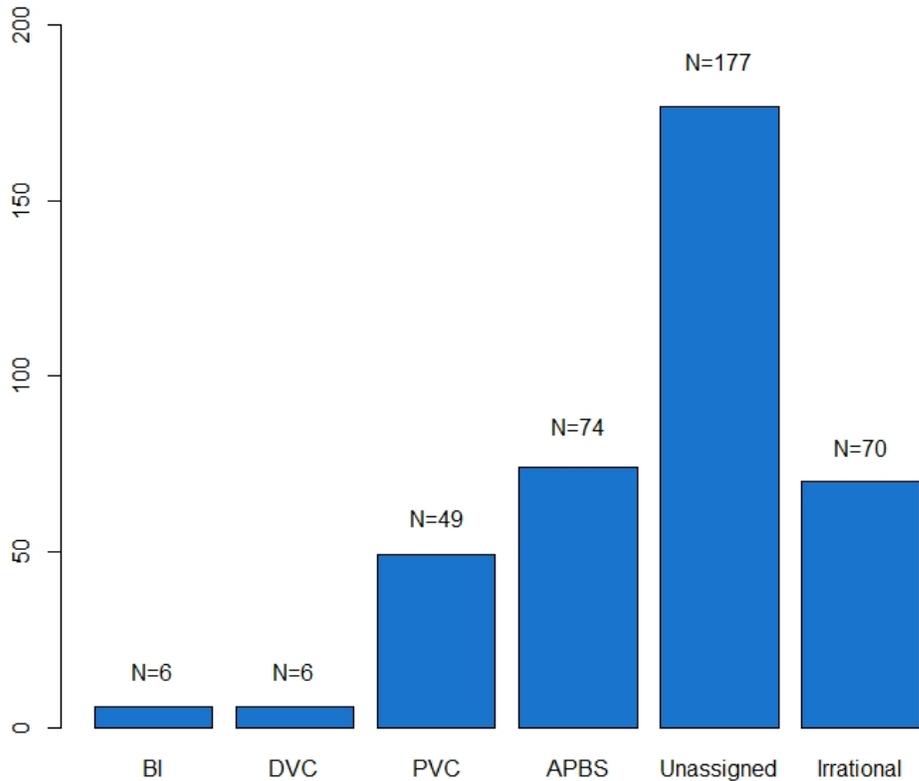


Finding 4:

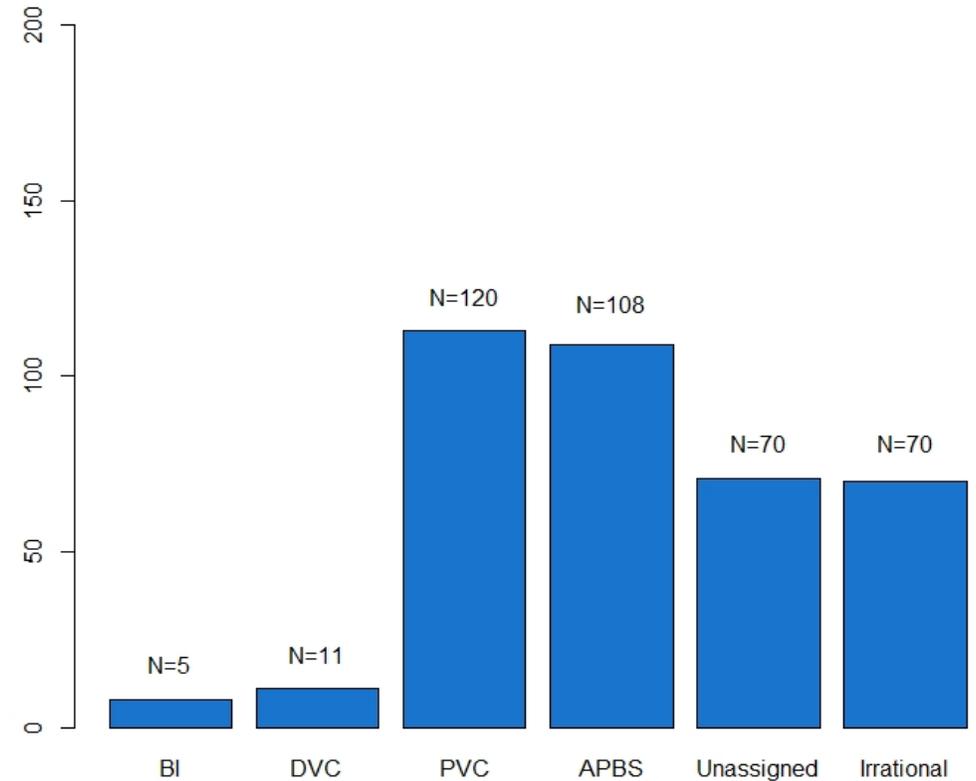
Almost no researchers use 'Bayesian inference' and 'deterministic vote counting'

The Results

Strict categorization of researchers into heuristic categories



Lenient categorization of researchers into heuristic categories

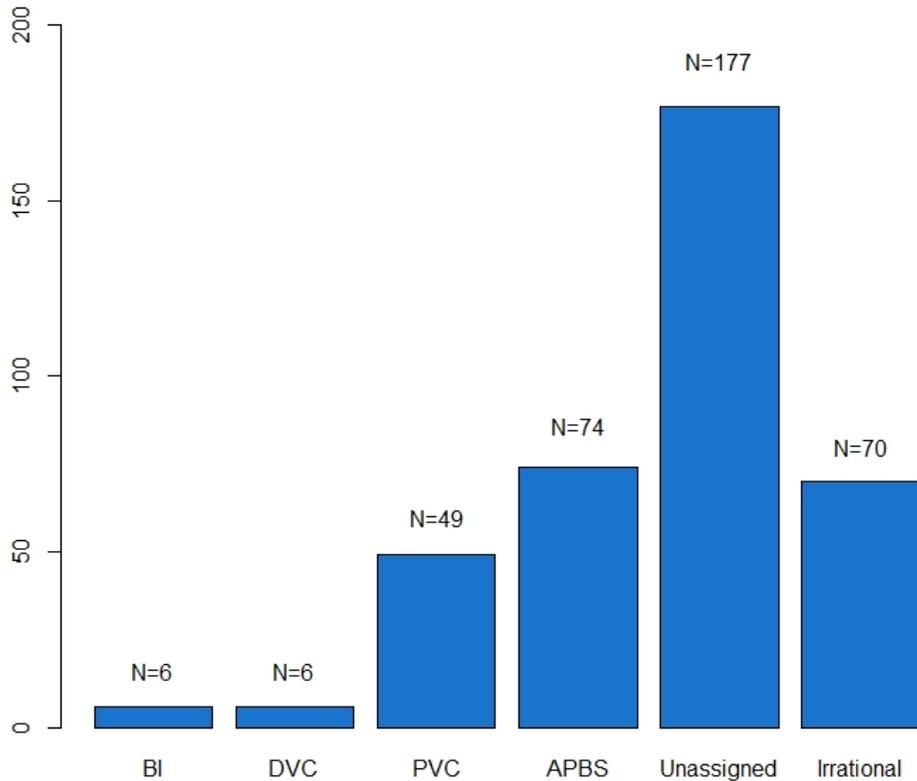


Finding 5:

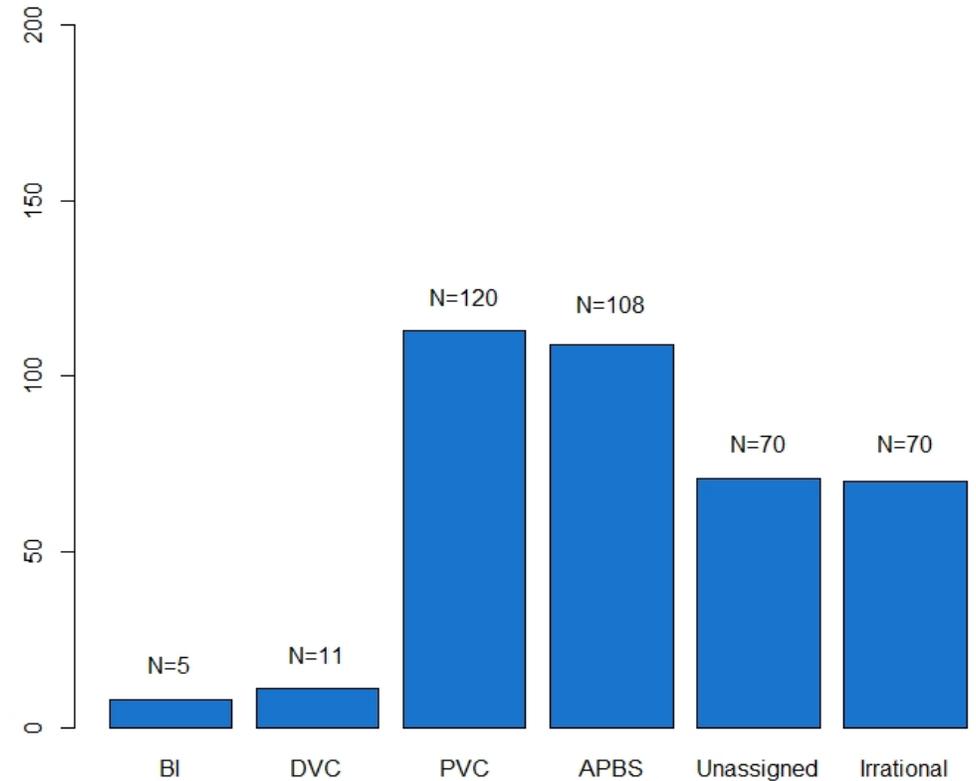
A significant amount of researchers use 'proportional vote counting' and 'averaging prior belief and significance'

The Results

Strict categorization of researchers into heuristic categories



Lenient categorization of researchers into heuristic categories



Finding 6:

A significant amount of researchers are classified as irrational

Conclusions

- Researchers often use simple decision rules to make sense of statistical results
- Researchers lack statistical intuition
- We need to educate researchers/educators
- Meta-education?



Questions



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Preprint:

<https://psyarxiv.com/xyks4>

Data and materials:

<https://osf.io/2g4wf>