

# Improving your research with simulation

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# Resources

- power simulation workshop materials

<https://dalejbarr.github.io/kcl-orss>

- RStudio (if you already have it installed) OR
- webR (if you don't have RStudio installed)

<https://webr.r-wasm.org/latest>

```
install.packages(c("dplyr", "tibble", "purrr", "tidyr", "broom"))
```

# **Simulation: The what and the why**

# Knowing the ground truth

In psychology & neuroscience, we perform empirical studies to investigate unknown truths. These studies involve a series of decisions in design and analysis. It is critical to understand how these decisions and tools impact the conclusions that we draw, and how we operate as a science.

# Monte Carlo\* simulation

- Complex systems can be difficult to predict and analyze
- We can better understand a system by simulating it



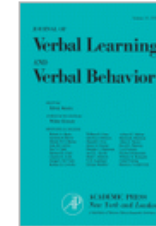
\* Named after the “*Monte Carlo casino*” in Monaco. Image Source: [https://commons.wikimedia.org/wiki/File:Real\\_Monte\\_Carlo\\_Casino.jpg](https://commons.wikimedia.org/wiki/File:Real_Monte_Carlo_Casino.jpg)

# Evaluating a statistical method




Journal of Verbal Learning and  
Verbal Behavior




Volume 15, Issue 2, April 1976, Pages 135-142



## More on the language-as-fixed-effect fallacy: Monte Carlo estimates of error rates for $F_1, F_2, F'$ , and $\min F'$

K.I. Forster , R.G. Dickinson

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[https://doi.org/10.1016/0022-5371\(76\)90014-1](https://doi.org/10.1016/0022-5371(76)90014-1) 

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# Evaluating experiment design choices



Psychological Methods

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ISSN: 1082-989X

<https://doi.org/10.1037/met0000717>

## Better Power by Design: Permuted-Subblock Randomization Boosts Power in Repeated-Measures Experiments

Jinghui Liang and Dale J. Barr

School of Psychology & Neuroscience, University of Glasgow

### *Abstract*

During an experimental session, participants adapt and change due to learning, fatigue, fluctuations in attention, or other physiological or environmental changes. This temporal variation affects measurement, potentially reducing statistical power. We introduce a restricted randomization algorithm, permuted-subblock randomization (PSR), that boosts power by balancing experimental conditions over the course of an experimental session. We used Monte Carlo simulations to explore the performance of PSR across four scenarios of time-dependent error: exponential decay (learning effect), Gaussian random walk, pink noise, and a mixture of the previous three. PSR boosted power by about 13% on average, with a range from 4% to 45% across a representative set of study designs, while simultaneously controlling the false positive rate when time-dependent variation was absent. An R package, `explan`, provides functions to implement PSR during experiment planning.

# Evaluating software tools

**PNAS**

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RESEARCH ARTICLE | NEUROSCIENCE | 



## Cluster failure: Why fMRI inferences for spatial extent have inflated false-positive rates

[Anders Eklund](#) , [Thomas E. Nichols](#), and [Hans Knutsson](#) [Authors Info & Affiliations](#)

Edited by Emery N. Brown, Massachusetts General Hospital, Boston, MA, and approved May 17, 2016 (received for review February 12, 2016)

**June 28, 2016** | 113 (28) 7900-7905 | <https://doi.org/10.1073/pnas.1602413113>



# Multiverse analysis

Perspectives on Psychological Science



[Journal indexing and metrics](#)



Free access

| Research article

| First published online September 29, 2016

## Increasing Transparency Through a Multiverse Analysis

[Sara Steegen](#), [Francis Tuerlinckx](#), [...], and [Wolf Vanpaemel](#) ✉ [+1](#) [View all authors and affiliations](#)

[Volume 11, Issue 5](#) | <https://doi.org/10.1177/1745691616658637>



Contents



PDF / ePub

## Abstract

Empirical research inevitably includes constructing a data set by processing raw data into a form ready for statistical analysis. Data processing often involves choices among several reasonable options for excluding, transforming, and coding data. We suggest that instead of performing only one analysis, researchers could perform a multiverse analysis, which

# Agent-based models

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### The natural selection of bad science

Paul E. Smaldino  and Richard McElreath

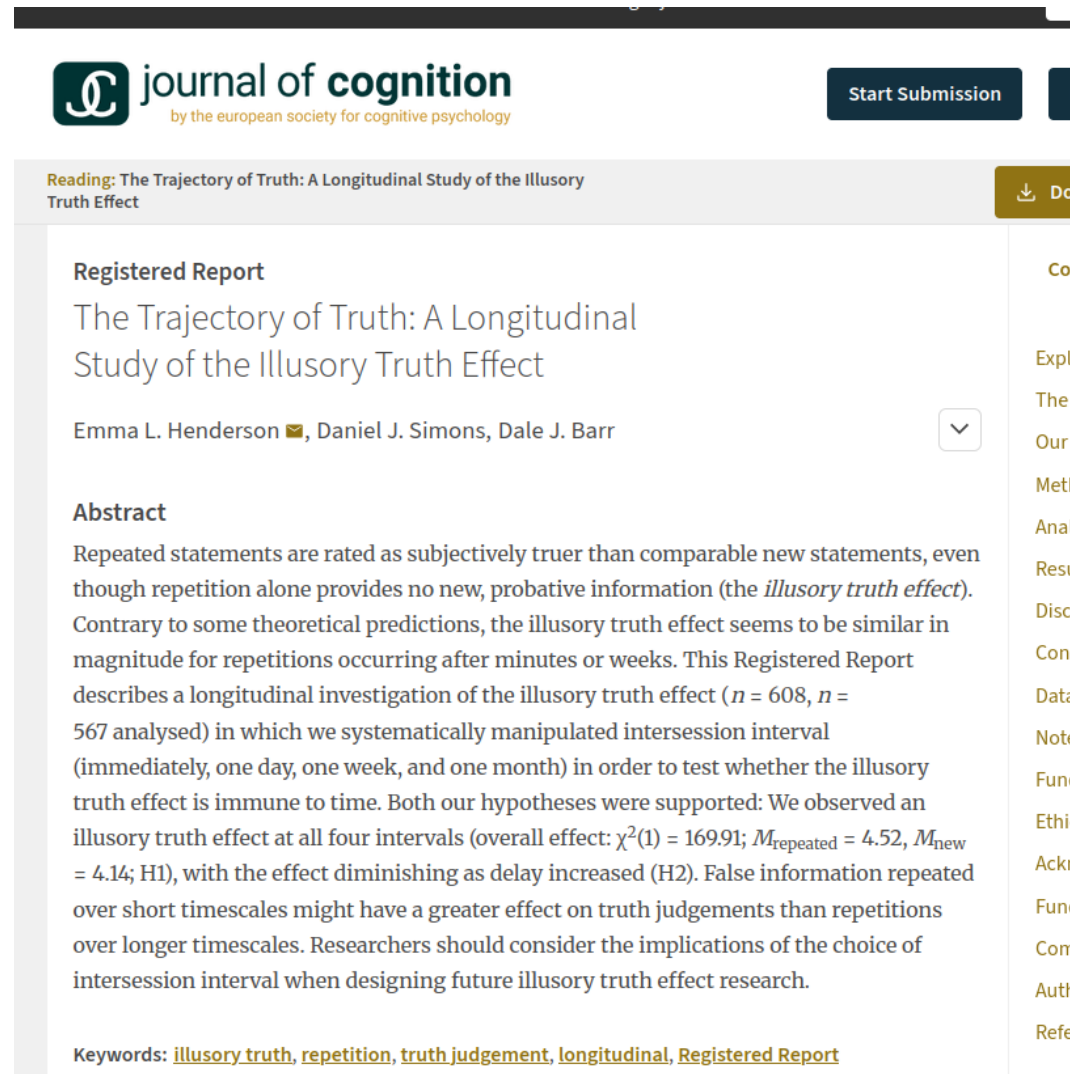
Published: 01 September 2016

<https://doi.org/10.1098/rsos.160384>



This article has a Correction

# Study planning: Power analysis



The screenshot shows the top of a web page for the 'Journal of Cognition'. The header includes the journal's logo and name, a 'Start Submission' button, and a navigation menu on the right. The main content area displays a 'Registered Report' titled 'The Trajectory of Truth: A Longitudinal Study of the Illusory Truth Effect' by Emma L. Henderson, Daniel J. Simons, and Dale J. Barr. The abstract describes a longitudinal investigation of the illusory truth effect, testing whether the effect is immune to time across different intersession intervals. The keywords listed are illusory truth, repetition, truth judgement, longitudinal, and Registered Report.

journal of cognition  
by the european society for cognitive psychology

Start Submission

Reading: The Trajectory of Truth: A Longitudinal Study of the Illusory Truth Effect

Registered Report

The Trajectory of Truth: A Longitudinal Study of the Illusory Truth Effect

Emma L. Henderson ✉, Daniel J. Simons, Dale J. Barr

**Abstract**

Repeated statements are rated as subjectively truer than comparable new statements, even though repetition alone provides no new, probative information (the *illusory truth effect*). Contrary to some theoretical predictions, the illusory truth effect seems to be similar in magnitude for repetitions occurring after minutes or weeks. This Registered Report describes a longitudinal investigation of the illusory truth effect ( $n = 608$ ,  $n = 567$  analysed) in which we systematically manipulated intersession interval (immediately, one day, one week, and one month) in order to test whether the illusory truth effect is immune to time. Both our hypotheses were supported: We observed an illusory truth effect at all four intervals (overall effect:  $\chi^2(1) = 169.91$ ;  $M_{\text{repeated}} = 4.52$ ,  $M_{\text{new}} = 4.14$ ; H1), with the effect diminishing as delay increased (H2). False information repeated over short timescales might have a greater effect on truth judgements than repetitions over longer timescales. Researchers should consider the implications of the choice of intersession interval when designing future illusory truth effect research.

**Keywords:** [illusory truth](#), [repetition](#), [truth judgement](#), [longitudinal](#), [Registered Report](#)

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<https://github.com/dalejbarr/truthiness>

# Basic workflow

