

Statistical Power

---- A non-technical view

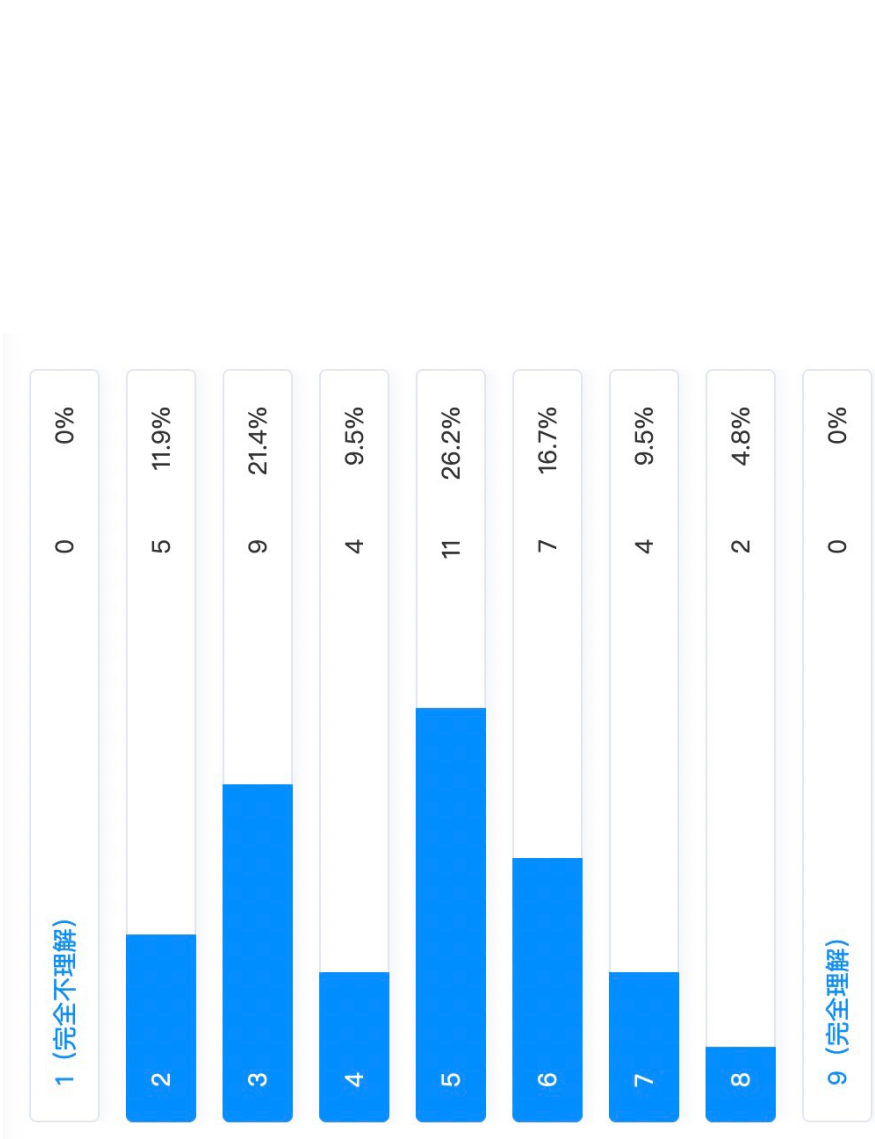
Hu Chuan-Peng (胡传鹏)

Nanjing Normal University

hcp4715@hotmail.com



$N = 42$





NHST下统计检验力分析中的四个变量

模型思维视角下的power analysis

历史与现实中的power analysis

替代的方案？

1. NHST框架下的Power analysis



Power contour estimation

Maximum sample size

10 200 1,000

10 110 210 310 410 510 610 710 810 910 1,000

Maximum number of trials

10 100 1,000

10 110 210 310 410 510 610 710 810 910 1,000

Alpha level

0.05

Mean difference

1

Within-subject SD

10

Between-subject SD

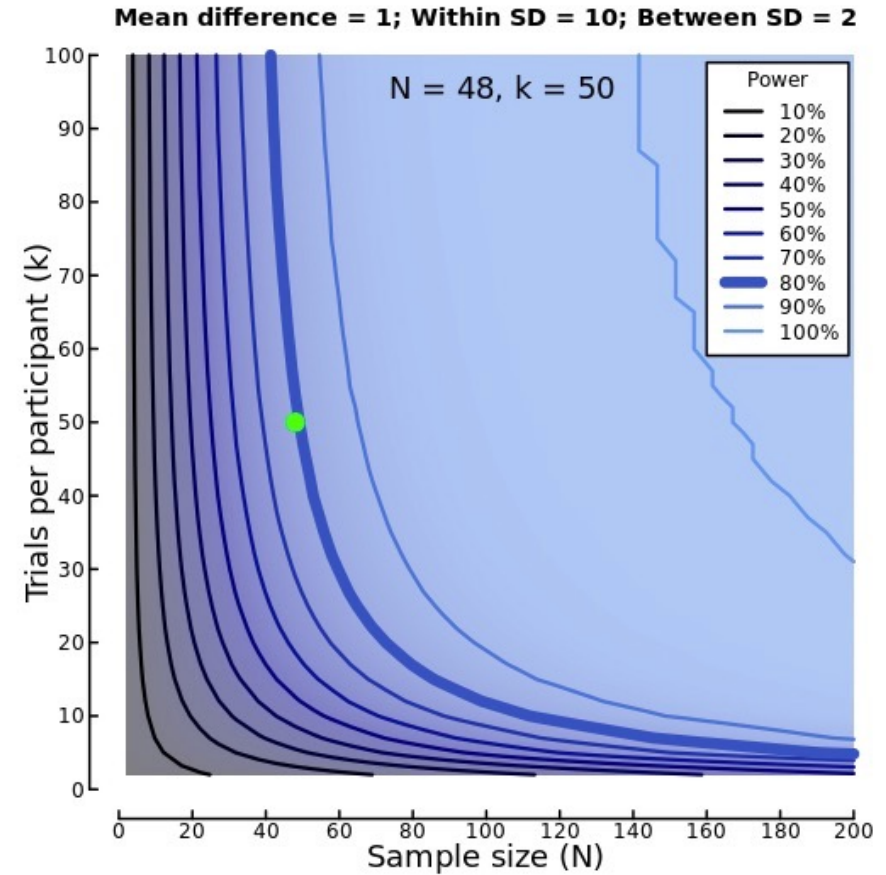
2

☒ Estimate optimal point?

Recruitment cost (trials)

0 100 1,000

0 100 200 300 400 500 600 700 800 900 1,000

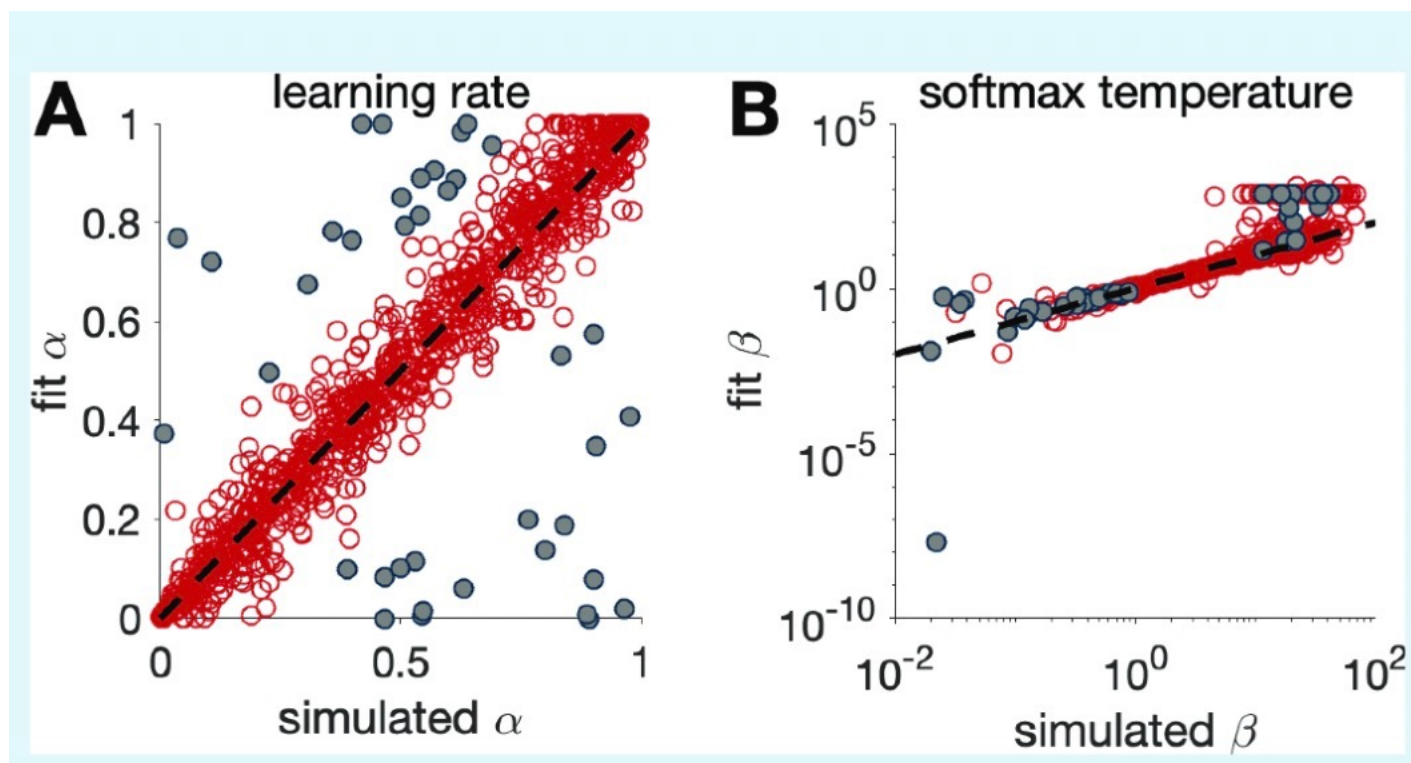


2. 模型思路下的Power analysis

- NHST本身是一个统计模型

2. 模型思路下的Power analysis

- Parameter recovery



3. 历史中的Power analysis

Journal of Abnormal and Social Psychology
1962, Vol. 65, No. 3, 145-153

THE STATISTICAL POWER OF ABNORMAL-SOCIAL PSYCHOLOGICAL RESEARCH:

A REVIEW ¹

JACOB COHEN

New York University

TABLE 2
VALUES OF POPULATION PARAMETERS WHICH DEFINE THE LEVELS OF SIZE OF EFFECT FOR THE
VARIOUS STATISTICAL TESTS

Test	Population parameter	Values		
		Small	Medium	Large
1. t (two means are equal)	$ M_1 - M_2 /\sigma$.25	.50	1.00
2. Normal (two proportions are equal)	$ P_1 - P_2 $.10	.20	.30
3. Normal (two r 's are equal)	$ r_1 - r_2 $.10	.20	.30
4. t ($r = 0$)	$ r $.20	.40	.60
5. Sign test	$ P - .50 $.10	.20	.30
6. F (k means are equal)	$\sigma_{M_i}/\sigma = f$.125	.25	.50
7a. χ^2 (k proportions are equal)	Ratio: $\frac{\text{Largest } P}{\text{Smallest } P}$	3:2	2:1	4:1
7b. χ^2 (contingency test)	$\sum_{i=1}^{kr} \frac{(P_{0i} - P_{1i})^2}{P_{0i}} = l$	Varies with table size, but uses criteria equivalent, for equal degrees of freedom, to 7a (see text).		

3. 历史中的Power analysis

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Trends in Cognitive Sciences

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OPINION | VOLUME 24, ISSUE 3, P200-207, MARCH 01, 2020

Avoid Cohen's 'Small', 'Medium', and 'Large' for Power Analysis

Joshua Correll • Christopher Mellinger • Gary H. McClelland • Charles M. Judd

Published: January 15, 2020 • DOI: <https://doi.org/10.1016/j.tics.2019.12.009>



3. 历史中的Power analysis



The screenshot shows the top navigation bar of the Annual Reviews website with links for 'JOURNALS A-Z', 'JOURNAL INFO', and 'PRICING & SUBSCRIPTIONS'. Below the navigation bar is a breadcrumb trail: 'Home / Annual Review of Psychology / Volume 59, 2008 / Maxwell, pp 537-563'. The main content area has a dark green background and features the title 'Sample Size Planning for Statistical Power and Accuracy in Parameter Estimation' in large white text. Below the title, it specifies 'Annual Review of Psychology', 'Vol. 59:537-563 (Volume publication date January 2008)', and a DOI link: 'https://doi.org/10.1146/annurev.psych.59.103006.093735'.

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JOURNALS A-Z JOURNAL INFO PRICING & SUBSCRIPTIONS

Home / Annual Review of Psychology / Volume 59, 2008 / Maxwell, pp 537-563

Sample Size Planning for Statistical Power and Accuracy in Parameter Estimation

Annual Review of Psychology
Vol. 59:537-563 (Volume publication date January 2008)
<https://doi.org/10.1146/annurev.psych.59.103006.093735>

our main focus is the desirability of achieving accurate parameter estimates, either instead of or in addition to obtaining sufficient power.

3. 历史中的Power analysis

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[Katherine S. Button](#), [John P. A. Ioannidis](#), [Claire Mokrysz](#), [Brian A. Nosek](#), [Jonathan Flint](#), [Emma S. J. Robinson](#) & [Marcus R. Munafò](#) 

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3. 历史中的Power analysis





NeuroImage
Volume 221, 1 November 2020, 117164



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and of latest practices (2017–2018) in high-impact
journals

Denes Szucs^a  , John PA. Ioannidis^b

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Reproducible brain-wide association studies require thousands of individuals

[Scott Marek](#) , [Brenden Tervo-Clemmens](#) , ... [Nico U. F. Dosenbach](#) 

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[Nature](#) **603**, 654–660 (2022) | [Cite this article](#)

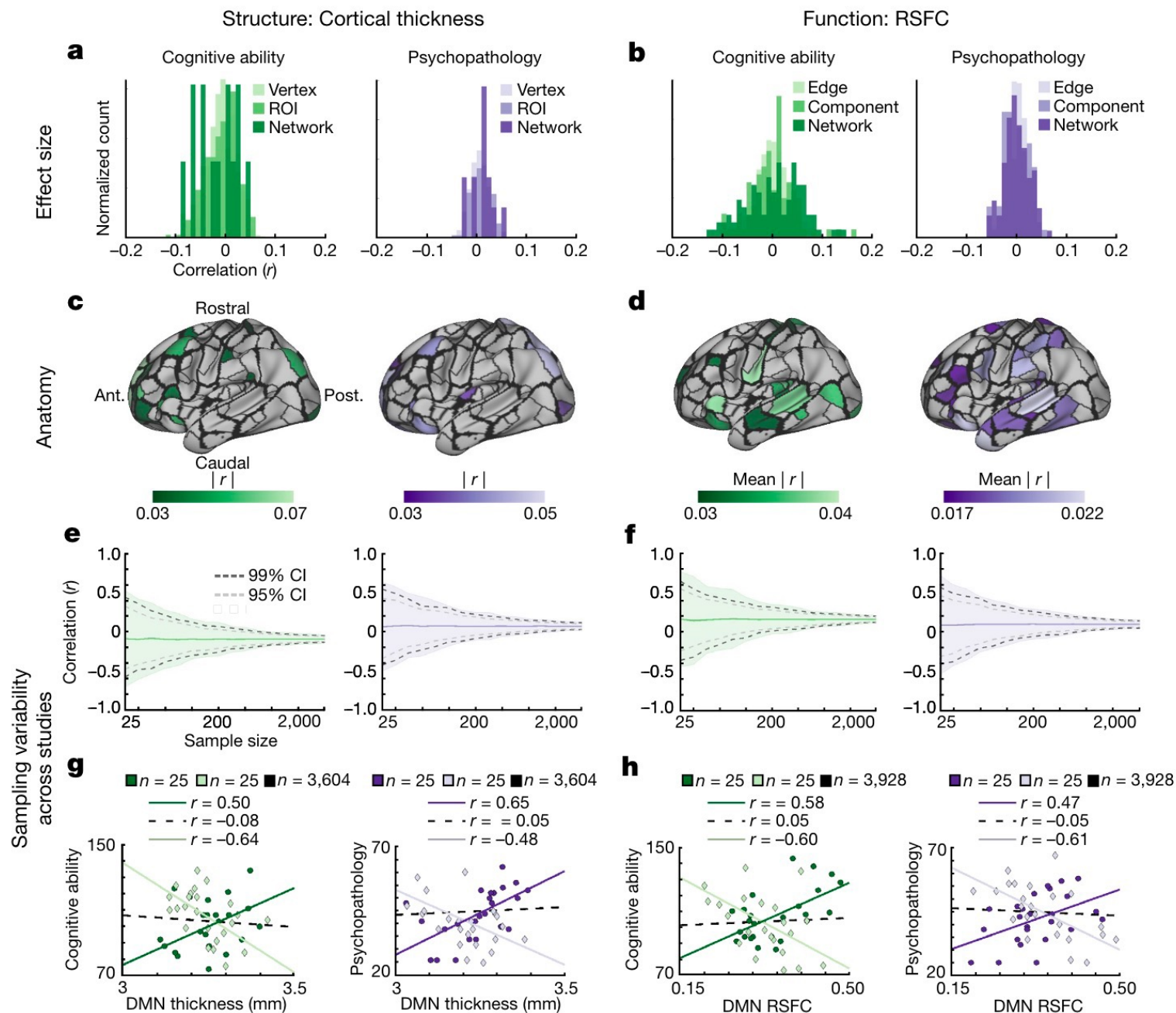
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Neuron

Volume 110, Issue 9, 4 May 2022, Pages 1446-1449



Spotlight

Brain-behavior correlations: Two paths toward reliability

Caterina Gratton^{1, 2} , Steven M. Nelson^{3, 4}, Evan M. Gordon⁵

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<https://doi.org/10.1016/j.neuron.2022.04.018>

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4. 替代方案

- Sample size justification or power analysis

4. 替代方案

Improving Your Statistical Inferences

Table of contents

Introduction

1 Using p-values to test a hypothesis

2 Error control

3 Likelihoods

4 Bayesian statistics

5 Asking Statistical Questions

6 Effect Sizes

7 Confidence Intervals

8 Sample Size Justification

9 Equivalence Testing and Interval

10 Sequential Analysis

Repeatedly analyzing incoming data while data collection is in progress has many advantages. Researchers can stop the data collection at an interim analysis when they can reject the null hypothesis or the smallest effect size of interest, even if they would be willing to collect more data if needed, or if the results show there is an unexpected problem with the study (e.g., participants misunderstand the instructions or questions). One could easily argue that psychological researchers have an ethical obligation to repeatedly analyze accumulating data, given that continuing data collection whenever the desired level of confidence is reached, or whenever it is sufficiently clear that the expected effects are not present, is a waste of the time of participants and the money provided by taxpayers. In addition to this ethical argument, designing studies that make use of sequential analyses can be more efficient than when data is only analyzed a single time, when the maximum sample size a researcher is willing to collect has been reached.

4. 替代方案

Psychological Methods
2017, Vol. 22, No. 2, 322–339

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1082-989X/17/\$12.00 <http://dx.doi.org/10.1037/met0000061>

Sequential Hypothesis Testing With Bayes Factors: Efficiently Testing Mean Differences

Felix D. Schönbrodt
Ludwig-Maximilians-Universität München

Eric-Jan Wagenmakers
University of Amsterdam

Michael Zehetleitner
Ludwig-Maximilians-Universität München

Marco Perugini
University of Milan–Bicocca

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希望大家hack得开心！