

DISCUSSION ABOUT *p*-VALUES

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3. Ioannidis (2005) Why Most Published Research Findings Are False, *PLoS Medicine*, 2(8), e124.
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5. Goodman (2008) A Dirty Dozen: Twelve P-Value Misconceptions, *Seminars in Hematology*, 45(3), 135-140.
6. Ziliak and McCloskey (2009) The Cult of Statistical Significance, *Section on Statistical Education, JSM*.
7. Hubbard and Bayarri (2012) Confusion Over Measures of Evidence (p 's) Versus Errors (α 's) in Classical Statistical Testing, *The American Statistician*, 57(3), 171-178.
8. Gelman (2013) P values and statistical practice, *Epidemiology*, 24(1), 69-72.
9. Greenland and Poole (2013) Living with p values: resurrecting a Bayesian perspective on frequentist statistics, *Epidemiology*, 24(1), 62-8.
10. Johnson (2013) Revised Standards for Statistical Evidence, *PNAS*, 110(48), 19313-19317.
11. Gelman and Loken (2014) The Statistical Crisis in Science, *American Scientist*, 102(6), page 460.
12. Nuzzo (2014) Scientific method: Statistical errors, *Nature*, 506, 150-152.
13. Ranganathan, Pramesh and Buyse (2015) Common pitfalls in statistical analysis: “P” values, statistical significance and confidence intervals, *Perspect Clinical Research*, 6(2), 116-117.
14. Aschwanden (2015) Not Even Scientists Can Easily Explain P-values, *FiveThirtyEight*.
15. Open Science Collaboration (2015) Estimating the reproducibility of psychological science, *Science*, 349(6251).
16. Johnson *et al* (2016) On the reproducibility of psychological science, *JASA*, 112, 1-10.

17. Wasserstein and Lazar (2016) *The ASA's Statement on p-Values: Context, Process, and Purpose*, *The American Statistician*, 70(2), 129-133. The following discussion articles appear in the online supplemental material.
- (a) Greenland, Senn, Rothman, Carlin, Poole, Goodman and Altman *Statistical Tests, P-values, Confidence Intervals, and Power: A Guide to Misinterpretations*.
 - (b) Altman Ideas from multiple testing of high dimensional data provide insights about reproducibility and false discovery rates of hypothesis supported by p-values.
 - (c) Benjamin and Berger A simple alternative to p-values.
 - (d) Benjamini It's not the p-values' fault.
 - (e) Berry P-values are not what they're cracked up to be.
 - (f) Carlin Comment: Is reform possible without a paradigm shift?
 - (g) Cobb ASA statement on p-values: Two consequences we can hope for.
 - (h) Gelman The problems with p-values are not just with p-values.
 - (i) Goodman The next questions: Who, what, when, where, and why?
 - (j) Greenland The ASA guidelines and null bias in current teaching and practice.
 - (k) Ioannidis Fit-for-purpose inferential methods: abandoning/changing P-values versus abandoning/changing research.
 - (l) Johnson Comments on the “ASA Statement on Statistical Significance and P-values” and marginally significant p-values.
 - (m) Lavine and Horowitz Comment.
 - (n) Lew Three inferential questions, two types of P-value.
 - (o) Little Discussion.
 - (p) Mayo Don't throw out the error control baby with the bad statistics bathwater.
 - (q) Millar ASA statement on p-values: some implications for education.
 - (r) Rothman Disengaging from statistical significance.
 - (s) Senn Are P-Values the Problem?
 - (t) Stangl Comment.
 - (u) Stark The value of p-values.
 - (v) Ziliak The significance of the ASA statement on statistical significance and p-values.
18. Greenland, Senn, Rothman, Carlin, Poole, Goodman and Altman (2016) *Statistical Tests, P-values, Confidence Intervals, and Power: A Guide to Misinterpretations*, *European Journal of Epidemiology*, 31, 337-350.
19. Aschwanden (2016) *Statisticians Found One Thing They Can Agree On: It's Time To Stop Misusing P-Values*, *FiveThirtyEight*.

20. Colquhoun (2016) An investigation of the false discovery rate and the misinterpretation of p-values, *Royal Society of Open Science*, 1(3), 140216.
21. Colquhoun (2016) The problem with *p*-values.
22. Szucs and Ioannidis (2016) Empirical assessment of published effect sizes and power in the recent cognitive neuroscience and psychology literature, *PLoS Biology*, 15(3), e2000797.
23. Kyriacou (2016) The Enduring Evolution of the P Value, *JAMA*, 315(11), 1113-1115.
24. Chavaliarias, Wallach, Li and Ioannidis (2016) Evolution of Reporting P Values in the Biomedical Literature, 1990-2015, *JAMA*, 315(11), 1141-8.
25. Colquhoun (2017) The reproducibility of research and the misinterpretation of p-values, *Royal Society Open Science*, 4(12).
26. Johnson, Payne, Wang, Asher and Mandal (2017) On the reproducibility of psychological science, *JASA*, 112(517), 1-10.
27. Nature's articles between February 2014 and July 2017
 - (a) Nuzzo (2014) Statistical errors: P values, the “gold standard” of statistical validity, are not as reliable as many scientists assume, *Nature*, 506, 13 February 2014, 150-152.
 - (b) Woolston (2015) Psychology journal bans P values, *Nature*, 519, 5 March 2015, page 9.
 - (c) Leek and Peng (2015) Statistics: P values are just the tip of the iceberg, *Nature*, 520, 30 April 2015, page 612.
 - (d) Nuzzo (2015) How scientists fool themselves – and how they can stop, *Nature*, 526, 8 October 2015, pages 182-185.
 - (e) Allison, Brown, George and Kaiser (2016) Reproducibility: A tragedy of errors, *Nature*, 530, 4 February 2016, pages 27-29.
 - (f) Baker (2016) Statisticians issue warning on P values: Statement aims to halt missteps in the quest for certainty, *Nature*, 531, 10 March 2016, page 10.
 - (g) Chawla (2017) P-value shake-up proposed: Big names in statistics want to shake up much-maligned P value, *Nature*, 548, 3 August 2017, pages 16-17.
28. Benjamin, Berger, Johannesson *et al* (2018) Redefine Statistical Significance, *Nature Human Behavior*, 2, 6-10.
29. Dickson (2018) The Significance Delusion: Inconvenient Truths about P-values. Slides of her presentation.
30. Dirnagl (2019) The p value wars (again), *European Journal of Nuclear Medicine and Molecular Imaging*, 46, 2421-2423.
31. Johnson (2019) Retiring significance: raise the bar, *Nature*, 567, 461.

32. Johnson (2019) Evidence from marginally significant t statistics, *The American Statistician*, 73(S1), 129-134.
33. Valentin Amrhein, Sander Greenland, Blake McShane *et al* (2019) Scientists rise up against statistical significance, *Nature*, 567, 305-307.
34. The American Statistician, Volume 73, Issue sup1 (2019)
Statistical Inference in the 21st Century: A World Beyond $p < 0.05$
- (a) Wasserstein, Schirm and Lazar Moving to a World Beyond “ $p < 0.05$ ”, Pages: 1-19.
 - (b) Ioannidis What Have We (Not) Learnt from Millions of Scientific Papers with P Values?, Pages: 20-25.
 - (c) Goodman Why is Getting Rid of P-Values So Hard? Musings on Science and Statistics, Pages: 26-30.
 - (d) Hubbard Will the ASA’s Efforts to Improve Statistical Practice be Successful? Some Evidence to the Contrary, Pages: 31-35.
 - (e) Kmetz Correcting Corrupt Research: Recommendations for the Profession to Stop Misuse of p-Values, Pages: 36-45.
 - (f) Kennedy-Shaffer Before $p < 0.05$ to Beyond $p < 0.05$: Using History to Contextualize p-Values and Significance Testing, Pages: 82-90.
 - (g) Greenland Valid P-Values Behave Exactly as They Should: Some Misleading Criticisms of P-Values and Their Resolution With S-Values, Pages: 106-114.
 - (h) Betensky The p-Value Requires Context, Not a Threshold, Pages: 115-117.
 - (i) Krueger and Heck Putting the P-Value in its Place, Pages: 122-128.
 - (j) Johnson Evidence From Marginally Significant t Statistics, Pages: 129-134.
 - (k) Fraser The p-value Function and Statistical Inference, Pages: 135-147.
 - (l) Benjamin and Berger Three Recommendations for Improving the Use of p-Values, Pages: 186-191.
 - (m) Colquhoun The False Positive Risk: A Proposal Concerning What to Do About p-Values, Pages: 192-201.
 - (n) Matthews Moving Towards the Post $p < 0.05$ Era via the Analysis of Credibility, Pages: 202-212.
 - (o) McShane, Gal, Gelman, Robert and Tackett Abandon Statistical Significance, Pages: 235-245.
 - (p) Hurlbert, Levine and Utts Coup de Grce for a Tough Old Bull: “Statistically Significant” Expires, Pages: 352-357.
 - (q) Fricker, Burke, Han and Woodall Assessing the Statistical Analyses Used in Basic and Applied Social Psychology After Their p-Value Ban, Pages: 374-384.
 - (r) Maurer, Hudburgh, Werwinski and Bailer Content Audit for p-value Principles in Introductory Statistics, Pages: 385-391.