# Post-hoc power: Don't do it.

www.biostat.ku.dk/~bxc/SDC-courses

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#### **Power calculation**

Power = P {rejecting the null hypothesis | assumptions}

#### Assumptions:

- ullet Significance level, lpha
- ullet Sample size, N
- ullet True treatment (/exposure) effect,  $\delta$
- Variance of the difference  $\sigma_{\delta}$

### Power calculation for $\delta = 0$ vs. $\delta \neq 0$

Observations  $x_1, \ldots, x_N$ , variance  $\sigma$ . Test statistic:

$$z = \frac{\bar{x} - 0}{\sigma / \sqrt{N}}$$

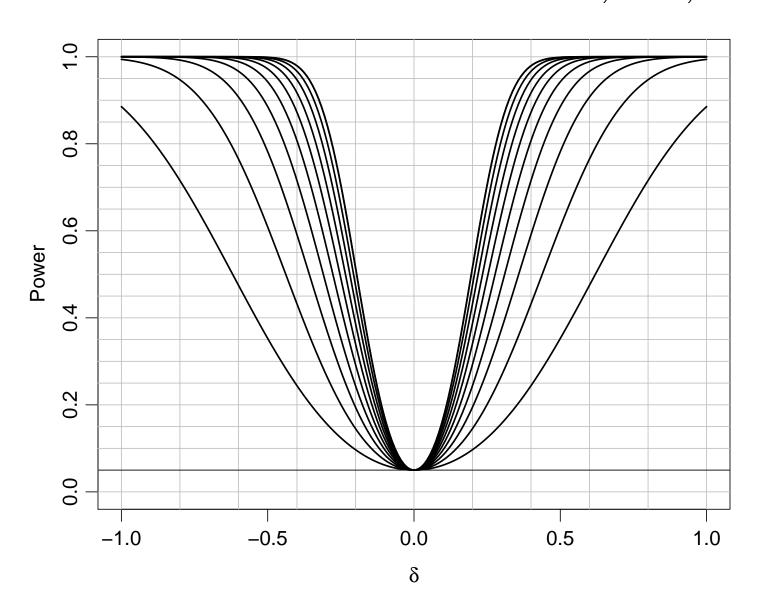
The null is rejected if |z| is large; two sided p-value:

$$p = 2 \times (1 - \Phi(|z|))$$

Power, if true effect is  $\delta$ :

$$\begin{aligned} & P\{|z| > 1.96\} \\ & = 1 - P\{-1.96 < \frac{\bar{x} - 0}{\sigma/\sqrt{N}} < 1.96\} \\ & = 1 - P\{-1.96 - \frac{\delta}{\sigma/\sqrt{N}} < \frac{\bar{x} - \delta}{\sigma/\sqrt{N}} < 1.96 - \frac{\delta}{\sigma/\sqrt{N}}\} \\ & = 1 + \Phi\left(-1.96 - \frac{\delta}{\sigma/\sqrt{N}}\right) - \Phi\left(1.96 - \frac{\delta}{\sigma/\sqrt{N}}\right) \end{aligned}$$

## Power functions for $N=10,\ldots,100$



### Post-hoc power calculations

Observed difference  $\hat{\delta} = \bar{x}$ .

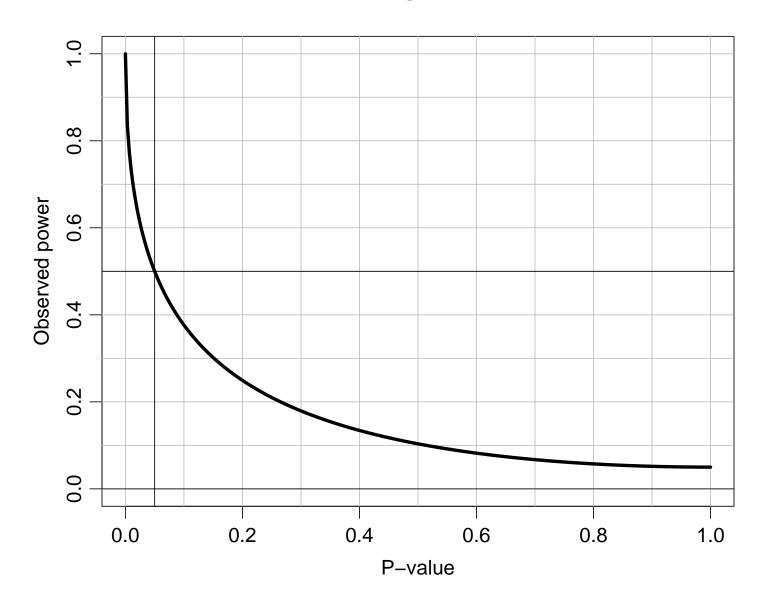
What is the power in this study to detect a difference of  $\hat{\delta}$ ? Answer:

$$1 + \Phi\left(-1.96 - \frac{\bar{x}}{\sigma/\sqrt{N}}\right) - \Phi\left(1.96 - \frac{\bar{x}}{\sigma/\sqrt{N}}\right)$$

But  $\frac{\bar{x}}{\sigma/\sqrt{N}}=z$  is the test statistic, which is a 1 to 1 function of the p-value,  $z=\Phi^{-1}(1-p/2).$ 

Observed power is a simple function of the p-value.

## P-value and observed power for ANY study



## The meaning of power (post hoc)

Power is the probability of the event:

"Rejecting  $H_0$ " in a (future) study.

Once the study is conducted, this probability is either

1 — if  $H_0$  were rejected

0 — it it was not.

Power is meaningless post hoc.

### **Dealing with reviewers**

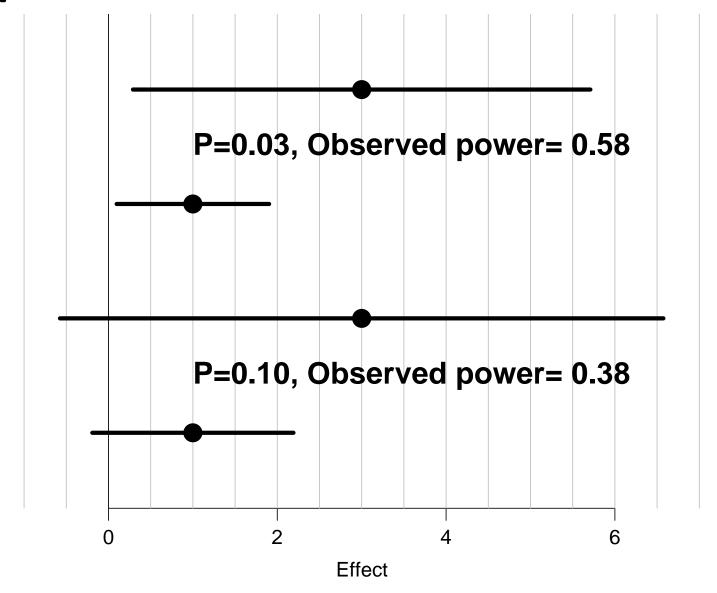
Refuse to do post-hoc power calculations.

Use a reference to Hoening & Heisey. A copy can be obtained from BxC.

Reviewers do not always have sound statistical advice to offer. A good discussion is given in Bacchetti's paper. See also the discussion in BMJ following it.

Some discussants argue that mention of the initial power calculation (pre-study) is useful — it shows that thought has been given to the design.

## Report and use the confidence interval



#### References

- [1] Peter Bacchetti. Peer rewiew of statistics in medical research: the other problem. *British Medical Journal*, 324:1271–1273, 2002.
- [2] JM Hoening and DM Heisey. The abuse of power: The pervasive fallacy of power calulatons for data analysis. *The American Statistician*, 55(1):19–24, 2001.