### Power Analysis

**Andres Namm** 

- Power analysis is a method used to determine the sample size for an measurably accurate experiment:
  - Confidence Intervals
  - Hypothesis Testing
- I'll be covering power analysis for confidence intervals and hypothesis testing separately as these experiments have a different nature.

## Aim is different for Confidence Intervals and Hypothesis Testing

• For Confidence intervals the aim of power analysis is to determine sample size n to achieve a specific width for the confidence interval

## Aim is different for Confidence Intervals and Hypothesis Testing

- For Hypothesis testing the aim of power analysis is to determine sample size n to reject H0 with a certain probability if it is false
  - This probability is called Power
  - Power=P(Reject H0 | H0 is false)
  - Usually Power is set to 80 %, 90 %

## Power Analysis for Confidence Intervals

### Theory

- Power analysis is used to determine the sample size needed to achieve a certain level of precision in the confidence interval (determined by the width of the interval)
- Input
  - Precision
  - Standard Deviation
  - Confidence 95 %, 99 %

### Theory for 1 sample, Continuous outcome



The margin of error in the one sample confidence interval for  $\mu$  can be written as follows:

$$E = Z \frac{\sigma}{\sqrt{n}}$$

Now we need to determine what the right E is for our experiment?

- For weights of cows E=10
- For weigths of cats E=0.5

Our goal is to determine the sample size, n, that ensures that the margin of error, "E," does not exceed a specified value. We can take the formula above and, with some algebra, solve for n:

$$n = \left(\frac{Z\sigma}{E}\right)^2$$

### Example

- https://sphweb.bumc.bu.edu/otlt/mphmodules/bs/bs704 power/bs704 power print.html
- Input
  - 95% confidence interval estimate, Z=1.96
  - Allowed E, margin of error 5 units.
  - Standard deviation is 20
- Output

$$n = \left(\frac{Z\sigma}{E}\right)^2 = \left(\frac{1.96(20)}{5}\right)^2 = 61.5$$
 5 = 1.96\frac{20}{\sqrt{62}}

# Power Analysis for Hypothesis testing

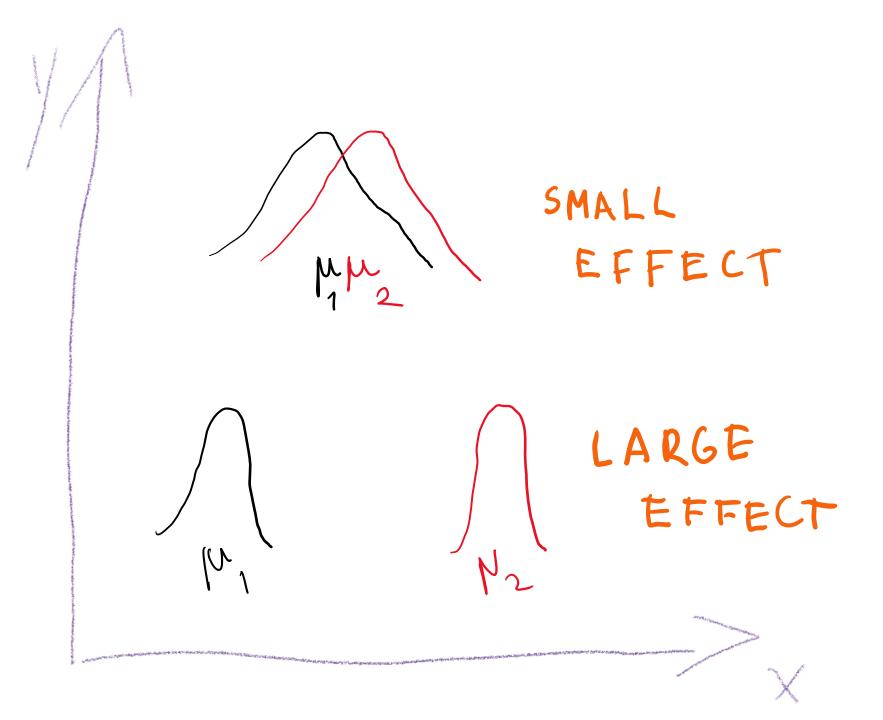
#### Intro

- For Hypothesis testing the aim of power analysis is to determine sample size n to reject H0 with a certain probability (Power) if it is false
- Input variables
  - Effect Size The difference we want to be able to classify as significant with probability=Power
  - Standard Deviation of data
  - Test Confidence 95 %, 99 %
    - Type I error P(Reject H0 | H0 is True)
  - Power (80%/90%) P(Rejecting H0 | H0 is False)
    - Power can be also called the probability of rejecting Type II error = P(Not Rejecting H0 | H0 is False)

### Effect Size

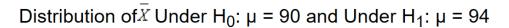
• 
$$E = \frac{\mu_1 - \mu_2}{\sigma}$$

• More Materials



#### Power

Effect Size = 
$$ES = \frac{\mu_1 - \mu_0}{\sigma}$$



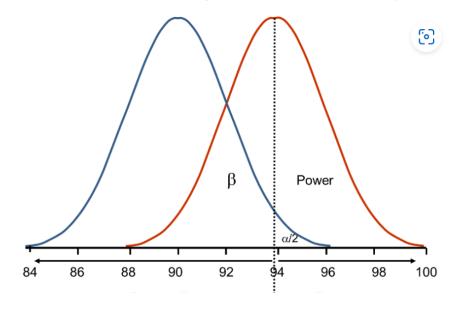
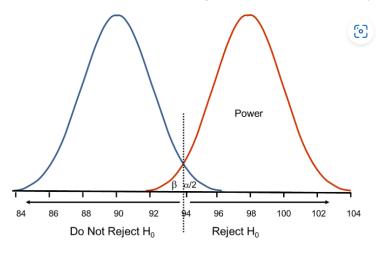


Figure - Distribution of *X* Under  $H_0$ :  $\mu$  = 90 and Under  $H_1$ :  $\mu$  = 98.



### Example

 https://sphweb.bumc.bu.edu/otlt/mphmodules/bs/bs704 power/bs704 power print.html

### References

 Lisa Sullivan, PhD, Professor of Biosatistics, Boston University School of Public Health, <u>Power and Sample Size Determination</u> (bu.edu)