### Unit 2: Foundations for Inference

# 3. The Central Limit Theorem

(2.5)

10/22/2018

# Quiz 3 - Hypothesis Testing

### Recap from last time

- 1. Null hypothesis testing is a framework for quantifying evidence
- 2. Whenever we pick a standard of evidence, we trade off Type I and Type II errors
- 3. We generally want to use two-sided tests, increasing our standard for evidence

### Key Ideas

- 1. Larger samples give us more precision
- 2. The Central Limit Theorem says that the Null distribution will generally approach the Normal distribution
- 3. Using theoretical distributions (instead of shuffled random distributions) makes statistical measures lossless compression

# Why large samples matter

Suppose I want to know if I can guess the outcomes of coin flips better than chance.

I flip the coin four times and guess correctly three out of four times!

What can we conclude?

Nothing!

**Intuition:** How likely am I to guess all 4 correctly by chance?

Each correct guess has chance guessing probability of .5. So guessing 4 in a row is

So even if guess ALL of them correctly, we still couldn't reject the null

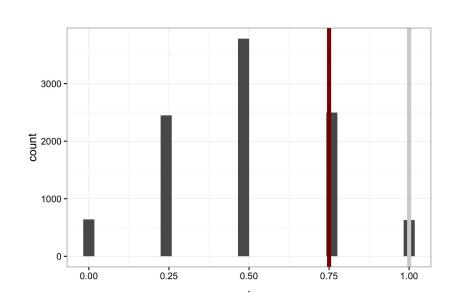
.5\*.5\*.5\*.5 = .0625

## If our sample is too small, we can never reject the null

Even if I have superhuman guessing ability, I can't tell if I flip 4 coins.

I do not have enough **statistical power** to detect the effect, even if the Alternative Hypothesis is true!

So what does power depend on?



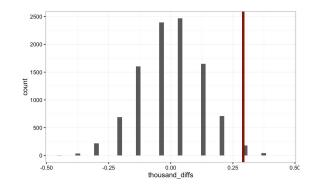
## Statistical power depends on...

My ability to reject the Null Hypothesis depends on:

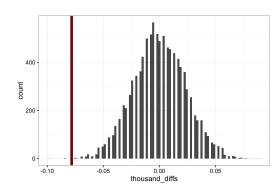
- The size of my sample
- The size of the difference between the True value of the population parameter and the value of the Null distribution population parameter
- My p-value criterion

It is shockingly easy to be in a regime where you can't infer anything no matter how the data turn out!

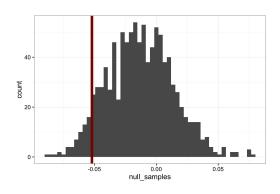
#### Our null distributions so far



Difference in proportion of women and men promoted



Difference in proportion of Cardiac arrests during meetings and non-meetings

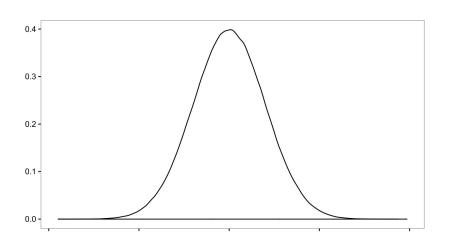


Difference in proportion of Curry's shots following successful vs. unsuccessful shots

What do these distributions have in common?

#### The Central Limit Theorem

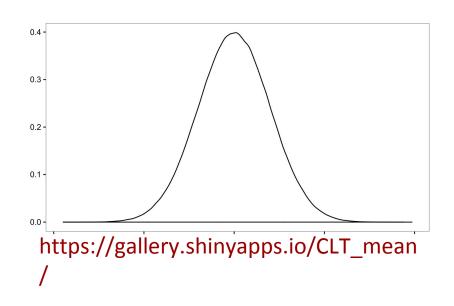
The null distribution for a proportion (or difference of proportions) will approximate the Normal Distribution as the sample size approaches infinity.



https://gallery.shinyapps.io/CLT\_prop/

#### The Central Limit Theorem

The null distribution for a mean of a distribution of **any** shape will also approach the Normal as the sample size approaches infinity



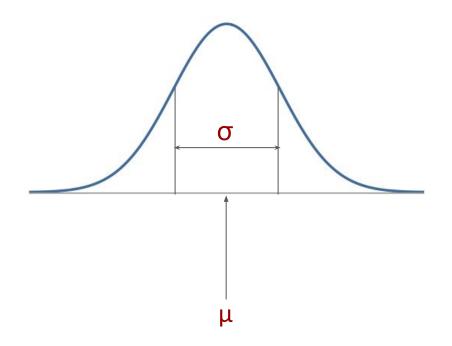
That's why the Normal Distribution is everywhere!

## Introducing the Normal Distribution

Unimodal and symmetric

Has two parameters:

- Mean (µ)
- Standard deviation (o)



The two parameters completely describe a Normal Distribution

#### **Different Normal Distributions**

Standard

Distribution

Normal

 $\mu$ : mean,  $\sigma$ : standard deviation

## Descriptive statistics

What's the difference between .mp3 and .FLAC? .jpeg and .png?

.mp3 and .jpeg are lossy compression -- they make data smaller by keeping only the most important parts of it.

Descriptive statistics are kind of lossy compression:

What one/few number(s) that best represent my data.

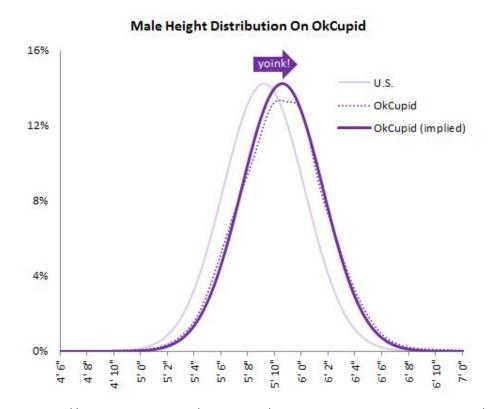
But a distribution's parameters are lossless compression.

They tell you everything there is to know about it.

## Detecting distortions by using a distribution's shape

OkCupid users are (likely) misreporting their heights in **two ways**.

What are they?



https://blog.okcupid.com/index.php/the-biggest-lies-in-online-dating/

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