

STAT 101  
Dr. Kari Lock Morgan

## Hypothesis Testing: Hypotheses

### SECTION 4.1

- Statistical test
- Null and alternative hypotheses
- Statistical significance

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### Review of Last Class

- The standard error of a statistic is the standard deviation of the sample statistic, which can be estimated from a bootstrap distribution
- Confidence intervals can be created using the standard error or the percentiles of a bootstrap distribution
- Confidence intervals can be created this way for any parameter, as long as the bootstrap distribution is approximately symmetric and continuous

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### Extrasensory Perception

Is there such a thing as extrasensory perception (ESP) or a “sixth sense”?

Do you believe in ESP?

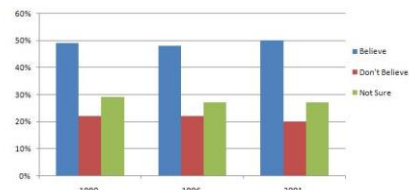
- a) Yes
- b) No

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### Extrasensory Perception

Belief in extrasensory perception (ESP) in 1990, 1996, and 2001



SOURCE: Americans' Belief in Psychic and Paranormal Phenomena Is up Over Last Decade (8 June 2001), <http://www.gallup.com/poll/4483/Americans-Belief-Psychic-Paranormal-Phenomena-Over-Last-Decade.aspx>

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### Extrasensory Perception

- One way to test for ESP is with Zener cards:



- Subjects draw a card at random and telepathically communicate this to someone who then guesses the symbol

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### Extrasensory Perception

- There are five cards with five different symbols
- If there is no such thing as ESP, what proportion of guesses should be correct?

- a)  $p = 0$
- b)  $p = 1/4$
- c)  $p = 1/5$
- d)  $p = 1/2$

*Because there are 5 cards, each person has a 1/5 chance of guessing correctly each time, if ESP does not exist.*

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## Extrasensory Perception

- As we've learned, statistics vary from sample to sample
- Even if the population proportion is  $1/5$ , not every sample proportion will be exactly  $1/5$
- **How do we determine when a sample proportion is far enough above  $1/5$  to provide evidence of ESP?**

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## Statistical Test

A **statistical test** uses data from a sample to assess a claim about a population

- In the ESP experiment, we want to use sample data to determine whether the population proportion of correct guesses is really higher than  $1/5$

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## Statistical Evidence

- Let  $\hat{p}$  denote the sample proportion of correct guesses in an ESP experiment
- Which of these sample statistics would give the strongest evidence for ESP?

- a)  $\hat{p} = 0$
  - b)  $\hat{p} = 1/5$
  - c)  $\hat{p} = 1/2$
  - d)  $\hat{p} = 3/4$
- 3/4 is the highest, so provides the strongest evidence of ESP.*

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## Extrasensory Perception

- Let's create our own sample proportion!
- Randomly choose a letter from A B C D E, and write it down (don't show anyone!)
- Find a partner; telepathically communicate your letter (no auditory or visual clues!), and have them guess your letter. Switch roles.
- Did you guess correctly?
  - a) Yes
  - b) No

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## Extrasensory Perception

- What is the sample proportion for our class?
- This provides
  - a) Strong evidence for ESP
  - b) Weak evidence for ESP
  - c) No evidence for ESP
  - d) Not sure
- Next class, we'll learn how to quantify this evidence!

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## Statistical Hypotheses

- Statistical tests are framed formally in terms of two competing hypotheses:

**Null Hypothesis ( $H_0$ ):** Claim that there is no effect or difference.

**Alternative Hypothesis ( $H_a$ ):** Claim for which we seek evidence.

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## Statistical Hypotheses

$H_0$ : Null hypothesis

$H_a$ : Alternative hypothesis

Competing claims about a population

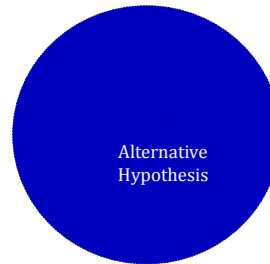
- The alternative hypothesis is established by observing evidence (data) that contradicts the null hypothesis and supports the alternative hypothesis
- Hypotheses are always about population parameters

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## Statistical Hypotheses

Usually the null is a very specific statement



?  
Null Hypothesis

Can we reject the null hypothesis?

ALL POSSIBILITIES

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## ESP Hypotheses

For the ESP experiment:

$H_0: p = 1/5$

No "effect" or no "difference"

$H_a: p > 1/5$

Claim we seek "evidence" for

- Helpful hints:
  - $H_0$  usually includes =
  - $H_a$  usually includes >, <, or  $\neq$
  - The inequality in  $H_a$  depends on the question

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## Sleep versus Caffeine



- Students were given words to memorize, then randomly assigned to take either a 90 min nap, or a caffeine pill. 2 1/2 hours later, they were tested on their recall ability.
- Explanatory variable: sleep or caffeine
- Response variable: number of words recalled
- Is sleep or caffeine better for memory?

Mednick, Cai, Kanady, and Drummond (2008). "Comparing the benefits of caffeine, naps and placebo on verbal, motor and perceptual memory," *Behavioral Brain Research*, 193, 79-86.

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## Sleep versus Caffeine

What is the parameter of interest in the sleep versus caffeine experiment?

- Proportion
- Difference in proportions
- Mean
- Difference in means
- Correlation

The response variable (number of words recalled) is quantitative and the explanatory variable (sleep or caffeine) is categorical, so we are interested in a difference in means.

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## Sleep versus Caffeine

- Let  $\mu_s$  and  $\mu_c$  be the mean number of words recalled after sleeping and after caffeine.
- Is there a difference in average word recall between sleep and caffeine?
- What are the null and alternative hypotheses?

a)  $H_0: \mu_s \neq \mu_c$ ,  $H_a: \mu_s = \mu_c$

b)  $H_0: \mu_s = \mu_c$ ,  $H_a: \mu_s \neq \mu_c$

c)  $H_0: \mu_s \neq \mu_c$ ,  $H_a: \mu_s > \mu_c$

d)  $H_0: \mu_s = \mu_c$ ,  $H_a: \mu_s > \mu_c$

e)  $H_0: \mu_s = \mu_c$ ,  $H_a: \mu_s < \mu_c$

The null hypotheses is "no difference," or that the means are equal. The alternative hypothesis is that there is a difference.

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## Difference in Hypotheses

- Note: the following two sets of hypotheses are equivalent, and can be used interchangeably:

$$\begin{array}{ll} H_0: \mu_1 = \mu_2 & H_0: \mu_1 - \mu_2 = 0 \\ H_a: \mu_1 \neq \mu_2 & H_a: \mu_1 - \mu_2 \neq 0 \end{array}$$

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## Hypotheses

- Take a minute to write down the hypotheses for each of the following situations:

- Does the proportion of people who support gun control differ between males and females?

$p_f$ : proportion of females who support gun control  $H_0: p_f = p_m$   
 $p_m$ : proportion of males who support gun control  $H_a: p_f \neq p_m$

- Is the average hours of sleep per night for college students less than 7?

$\mu$ : average hours of sleep per night for college students  $H_0: \mu = 7$   
 $H_a: \mu < 7$

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## Your Own Hypotheses

- Come up with a situation where you want to establish a claim based on data
- What parameter(s) are you interested in?
- What would the null and alternative hypotheses be?
- What type of data would lead you to believe the null hypothesis is probably not true?

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## Statistical Significance

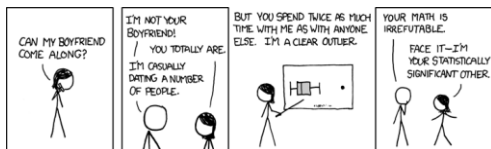
When results as extreme as the observed sample statistic are *unlikely* to occur by random chance alone (assuming the null hypothesis is true), we say the sample results are **statistically significant**

- If our sample is statistically significant, we have convincing evidence against  $H_0$ , in favor of  $H_a$
- If our sample is not statistically significant, our test is inconclusive

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## Statistical Significance



[www.xkcd.com](http://www.xkcd.com)

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## Note on Statistical Significance

- Statistical significance is a difficult concept, but also one of the most fundamental concepts of the course
- We return to this concept almost every class for the rest of the semester, so
  - it will get easier!
  - it's worth thinking deeply about!

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## Sleep versus Caffeine

$\mu_s$  and  $\mu_c$ : mean number of words recalled after sleeping and after caffeine

$$H_0: \mu_s = \mu_c, H_a: \mu_s \neq \mu_c$$

The sample difference in means is  $\bar{x}_s - \bar{x}_c = 3$ , and this is statistically significant. We can conclude...

- a) there is a difference between sleep and caffeine for memory (and data show sleep is better)
- b) there is not a difference between sleep and caffeine for memory
- c) nothing

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## Extrasensory Perception

$p$  = Proportion of correct guesses

$$H_0: p = 1/5$$

$$H_a: p > 1/5$$



- If results are statistically significant...
  - the sample proportion of correct guesses is higher than is likely just by random chance (if ESP does not exist and  $p = 1/5$ )
  - we have evidence that the true proportion of correct guesses really is higher than  $1/5$ , and thus have evidence of ESP

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## Extrasensory Perception

$p$  = Proportion of correct guesses

$$H_0: p = 1/5$$

$$H_a: p > 1/5$$



- If results are NOT statistically significant...
  - the sample proportion of correct guesses could easily happen just by random chance (if ESP does not exist and  $p = 1/5$ )
  - we do not have enough evidence to conclude that  $p > 1/5$ , or that ESP exists

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## Key Question

*How unusual is it to see a sample statistic as extreme as that observed, if  $H_0$  is true?*

- If it is very unusual, we have *statistically significant* evidence against the null hypothesis
- How do we measure how unusual a sample statistic is, if  $H_0$  is true?

**SIMULATE what would happen if  $H_0$  were true!**

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## ESP

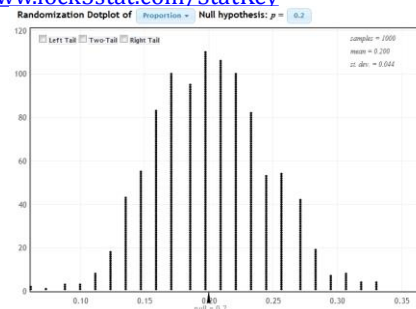
- How could we simulate what would happen, just by random chance, if the null hypotheses were true for the ESP experiment?
- Roll a die.
  - 1 = "correct letter"
  - 2-5 = "wrong letter"
  - 6 = roll again
- Did you get the correct letter?
  - (a) Yes
  - (b) No

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## ESP – Random Chance

- [www.lock5stat.com/StatKey](http://www.lock5stat.com/StatKey)



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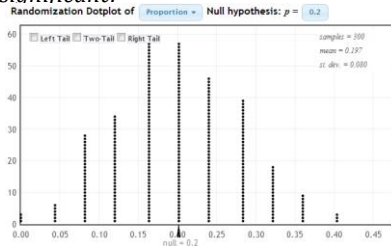
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## ESP

Based on the distribution below, do you think the results of our class ESP experiment are *statistically significant*?

- a) Yes
- b) No



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## ESP

- What does this imply about ESP?
  - a) Evidence that ESP exists
  - b) Evidence that ESP does not exist
  - c) Impossible to tell

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## Summary

- Statistical tests use data from a sample to assess a claim about a population
- Statistical tests are usually formalized with competing hypotheses:
  - Null hypothesis ( $H_0$ ): *no effect or no difference*
  - Alternative hypothesis ( $H_a$ ): *what we seek evidence for*
- If it would be unusual to get results as extreme as that observed, just by random chance, if the null were true, then the data is statistically significant
- If data are statistically significant, we have convincing evidence against the null hypothesis, and in favor of the alternative

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## Project 1

- Pose a question that you would like to investigate. If possible, choose something related to your major!
- Find or collect data that will help you answer this question (you may need to edit your question based on available data)
- You can choose either a single variable or a relationship between two variables
- See [Finding Data](#) for help finding data

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## Project 1

- The result will be a five page paper including
  - Description of the data collection method, and the implications this has for statistical inference
  - Descriptive statistics (summary stats, visualization)
  - Confidence interval
  - Hypothesis test
- Proposal due next Monday, 2/17
  - If using existing data: include link to data, relevant summary statistic
  - If collecting your own data, proposal should include a detailed data collection plan

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## Sample or Population?

- If your data represents a sample from a population, inference makes sense
- If you have data on the entire population, you will be asked to take a random sample and do inference

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**To Do**

- Read Section 4.1
- Project 1 Proposal (due Monday 2/17)