## Lecture 18

## Confidence Intervals & Hypothesis Testing

STAT 8010 Statistical Methods I October 2, 2019

> Whitney Huang Clemson University



## Agenda

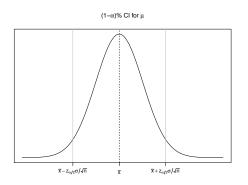
- Confidence Intervals
- 2 Hypothesis Testing



## Notes

Notes

## Last Lecture: Confidence Intervals for $\boldsymbol{\mu}$





Notes			

## **Example: Average Height**

We measure the heights of 40 randomly chosen men, and get a mean height of 5'9" (≈175cm). Suppose we know the standard deviation of men's heights is 4" ( $\approx$ 10cm). Find the 95% confidence interval of the true mean height of ALL men.

## WORLD HEIGHT CHART(MALE)





Notes

Notes

		_
		_
		_
		—

## **Average Height Example Cont'd**

- O Point estimate:  $\bar{X}_{40} = \frac{\sum_{i=1}^{40} X_i}{40} = 69$  inches
- ② Population standard deviation:  $\sigma = 4$  inches
- **3** Standard error of  $\bar{X}_{n=40} = \frac{\sigma}{\sqrt{n}} = \frac{4}{\sqrt{40}} = 0.63$  inches
- **95%CI:** Need to find  $z_{0.05/2} = 1.96$  from the Z-table
- **95%** CI for  $\mu_X$  is:

$$[69 - 1.96 \times 0.63, 69 + 1.96 \times 0.63]$$
  
= [67.77, 70.23]



## **Properties of Confidence Intervals**

- In contrast with the point estimate,  $\bar{X}_n$ , a  $(1 \alpha)$ % CI is an interval estimate, where the length of CI reflects our estimation uncertainty
- Typical  $\alpha$  values: 0.01, 0.05, 0.1  $\Rightarrow$  99%, 95%, 90% confidence intervals. Interpretation: If we were to take random samples over and over again, then  $(1 - \alpha)$ % of these confidence intervals will contain the true  $\boldsymbol{\mu}$
- The length of a CI depends on
  - ullet Population Standard Deviation:  $\sigma$
  - Confidence Level:  $1 \alpha$
  - Sample Size: n

Intervals & Hypothesis Testing
CLEMS N
Confidence Intervals

Notes			

## **Sample Size Calculation**

- $\bullet$  We may want to estimate  $\mu$  with a confidence interval with a predetermined margin of error (i.e.  $z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$ )
- For example, in estimating the true mean height of All men we may want our CI to be just 0.5 inches in
- The question is then, "how many observations do we need to take so that we have the desired margin of error?"



N	0	te	);

## Sample Size Calculation Cont'd

To compute the sample size needed to get a CI for  $\boldsymbol{\mu}$  with a specified margin of error, we use the formula below

$$n = \left(\frac{Z_{\alpha/2} \times \sigma}{\text{Margin of error}}\right)^2$$

Exercise: Derive this formula using margin of error  $= z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$ 



Notes

## **Average Height Example Revisited**

Compute the sample size needed in order to estimate the true mean height of All men such that the 95% CI to be 0.5 inches in width

- Length of CI:  $2 \times z_{0.025} \frac{\sigma}{\sqrt{n}} = 2 \times$  margin of error
- ② Want to find n s.t.  $z_{0.025} \frac{\sigma}{\sqrt{n}} = 0.25$
- **9** We have  $n = \left(\frac{1.96 \times 4}{0.25}\right)^2 = 983.4496$

Therefore, the required sample size is 984



Notes

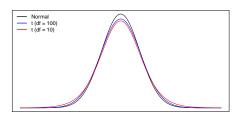
## Confidence Intervals When $\sigma$ Unknown

- $\bullet$  In practice, it is unlikely that  $\sigma$  is available to us
- $\bullet$  One reasonable option is to replace  $\sigma$  with s, the sample standard deviation
- We need to account for this added uncertainty with a (slightly) different sampling distribution that has fatter tails
  - ⇒ Student t Distribution (William Gosset, 1908)



## Notes

## **Student t Distribution**



- Recall the standardize sampling distribution  $\frac{\bar{X}_0-\mu}{\frac{\sigma}{\sqrt{\eta}}}\sim N(0,1)$
- Similarly , the studentized sampling distribution  $\frac{\bar{X}_{n}-\mu}{\frac{N}{\sqrt{n}}}\sim \mathrm{t}(df=n-1)$



Notes

## Confidence Intervals (CIs) for $\mu$ When $\sigma$ is Unknown



$$\left[\bar{X}_n - t_{\frac{\alpha}{2},n-1} \frac{s}{\sqrt{n}}, \bar{X}_n + t_{\frac{\alpha}{2},n-1} \frac{s}{\sqrt{n}}\right],\,$$

where  $t_{\frac{\alpha}{2},n-1}$  is the 1  $-\frac{\alpha}{2}$  percentile of a student t distribution with the degrees of freedom =n-1

•  $\frac{s}{\sqrt{n}}$  is an estimate of the standard error of  $\bar{X}_n$ 



Notes

## **Average Height Example Revisited**

We measure the heights of 40 randomly chosen men, and get a mean height of 5'9" (≈175cm), and a standard deviation of 4.5" ( $\approx$ 11.4cm). Find the 95% confidence interval of the true mean height of ALL men.



N	otoc
I۷	otes

Notes

## **Average Height Example Cont'd**

- Point estimate:  $\bar{X}_{40} = \frac{\sum_{i=1}^{40} X_i}{40} = 69$  inches
- ② Sample standard deviation: s = 4.5 inches
- (Estimated) standard error of  $\bar{X}_{n=40} = \frac{s}{\sqrt{n}} = \frac{4.5}{\sqrt{40}} = 0.71$  inches
- (or using a statistical software)
- **95%** CI for  $\mu_X$  is:

$$\begin{aligned} &[69-2.02\times0.71,69+2.02\times0.71]\\ &=[67.57,70.43] \end{aligned}$$



## **Hypothesis Testing**

- Hypothesis Testing: A method for using sample data to decide between two competing claims (hypotheses) about a population characteristic (a parameter. e.g.  $\mu$ )
- Examples:
  - The true mean starting salary for graduates of four-year business schools is \$4,500 per month  $\Rightarrow \mu = 4,500$
  - The true mean monthly income for systems analysts is at least \$6,000  $\Rightarrow \mu \geq$  6,000



Notes

## **Hypotheses**

- Null Hypothesis: A claim about a population characteristic that is initially assumed to be true. We use H<sub>0</sub> to denote a null hypothesis
- Alternative Hypothesis: The competing claim, denoted by H<sub>a</sub>
- In carrying out a test of  $H_0$  versus  $H_a$ , the hypothesis  $H_0$  will be rejected in favor of  $H_a$  only if sample evidence strongly suggests that  $H_0$  is false. If the sample data does not contain such evidence,  $H_0$  will not be rejected
- Therefore, the two possible decisions in a hypothesis test are:
  - Reject H<sub>0</sub> (and go with H<sub>a</sub>)
  - Fail to Reject H₀



# Notes

## **Courtroom Analogy**

- In a criminal trial, we use the rule "innocent until proven guilty"
- Therefore, our hypotheses are:
  - H<sub>0</sub>: Innocent
  - Ha: Guilty
- If we have strong evidence that the accused is not innocent, we reject H<sub>0</sub> (innocent) and conclude H<sub>a</sub> (guilty)
- If we do not have enough evidence to say that the accused is guilty, we do not say that the accused is "innocent". Instead, we say that the accused is "not guilty"



Notes

Hypotheses

Be careful setting up hypotheses:

- A statistical hypothesis test is only capable of demonstrating strong support for the alternative hypothesis H<sub>a</sub> (by rejecting the null hypothesis H<sub>0</sub>)
- Failing to reject H<sub>0</sub> does not show strong support for the null hypothesis – only a lack of strong evidence against H<sub>0</sub>, the null hypothesis

Confidence Intervals & Hypothesis Testing
CLEMS N
Hypothesis Testing

Notes			

The  $2\times 2$  Decision Paradigm for Hypothesis Testing

	Decision	
True State	Reject H <sub>0</sub>	Fail to reject
		$H_0$
$H_0$ is true	Incorrect:	Correct
	Type I error	
$H_0$ is false	Correct	Incorrect:
		Type II error

## **Errors in Hypothesis Testing**

- $\bullet$  The probability of a type I error is denoted by  $\alpha$
- $\bullet$  The probability of a type II error is denoted by  $\beta$



Notes	
Notes	
Notes	