

Lecture 14: Finish 8.2 Sample Mean; 9.1 Inference for Categorical Variable: Confidence Intervals

- 68-95-99.7 Rule; Checking Assumptions
- 3 Forms of Inference
- Probability vs. Confidence
- Constructing Confidence Interval
- Sample Size; Level of Confidence

Looking Back: *Review*

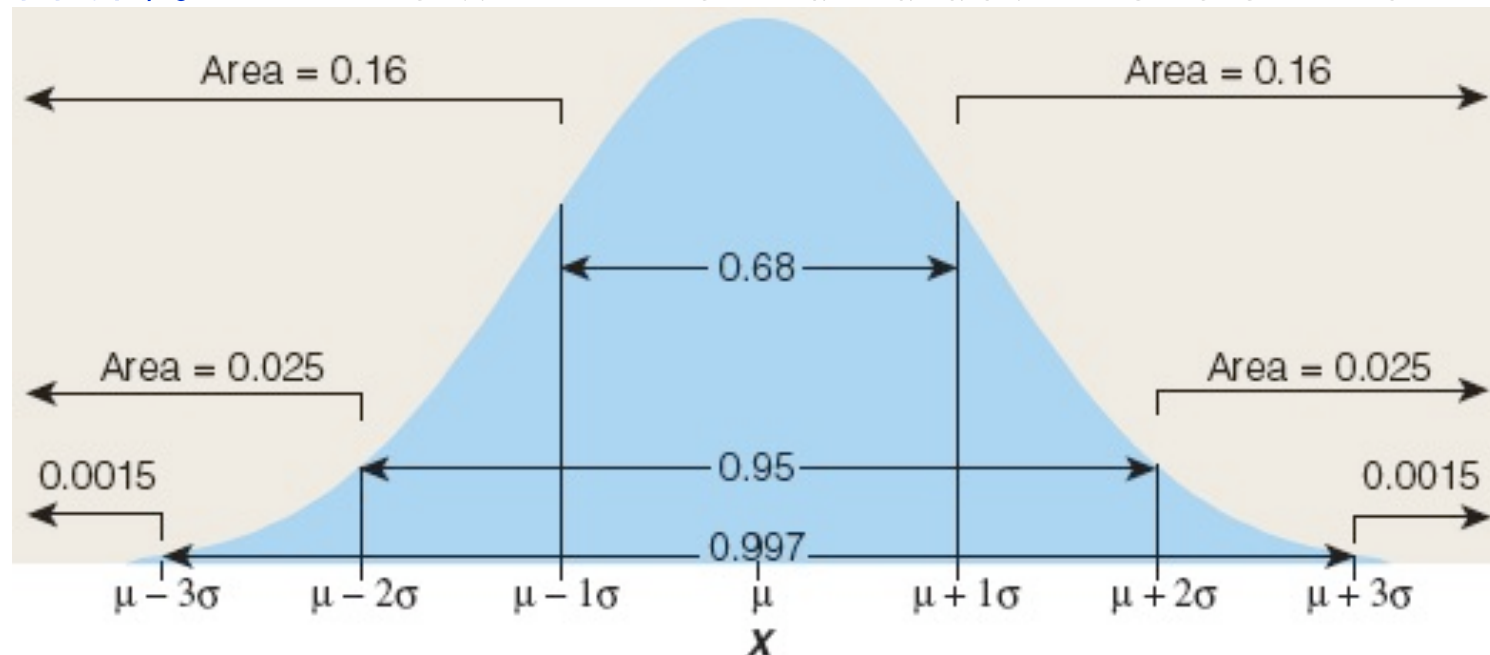
□ 4 Stages of Statistics

- Data Production (discussed in Lectures 1-3)
- Displaying and Summarizing (Lectures 3-8)
- Probability
 - Finding Probabilities (discussed in Lectures 9-10)
 - Random Variables (discussed in Lectures 10-12)
 - Sampling Distributions
 - Proportions (discussed in Lecture 13)
 - Means (began in Lecture 13)
- Statistical Inference

68-95-99.7 Rule for Normal R.V. (Review)

Sample at random from normal population; for sampled value X (a R.V.), probability is

- 68% that X is within 1 standard deviation of mean
- 95% that X is within 2 standard deviations of mean
- 99.7% that X is within 3 standard deviations of mean



68-95-99.7 Rule for Sample Mean

For sample means \bar{X} taken at random from large population with mean μ , s.d. σ , probability is

- 68% that \bar{X} is within $1\frac{\sigma}{\sqrt{n}}$ of μ
- 95% that \bar{X} is within $2\frac{\sigma}{\sqrt{n}}$ of μ
- 99.7% that \bar{X} is within $3\frac{\sigma}{\sqrt{n}}$ of μ

These results hold only if n is large enough.

Example: 68-95-99.7 Rule for 8 Dice

- **Background:** Population of dice rolls has $\mu = 3.5$, $\sigma = 1.7$. For random samples of size 8, sample mean roll \bar{X} has mean 3.5, standard deviation 0.6, and shape fairly normal.
- **Question:** What does 68-95-99.7 Rule tell us about the behavior of \bar{X} ?
- **Response:** The probability is approximately
 - 0.68 that \bar{X} is within _____ of _____: in (2.9, 4.1)
 - 0.95 that \bar{X} is within _____ of _____: in (2.3, 4.7)
 - 0.997 that \bar{X} is within _____ of _____: in (1.7, 5.3)

Typical Problem about Mean (*Review*)

The numbers 1 to 20 have mean 10.5, s.d. 5.8.

If numbers picked “at random” by sample of 400 students has mean 11.6, does this suggest bias in favor of higher numbers?

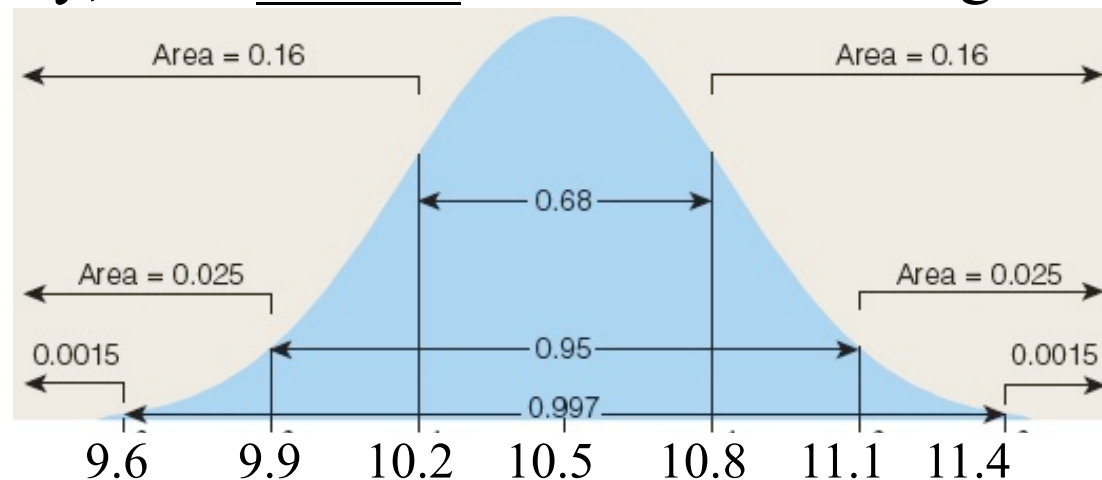
Solution Method: Assume (temporarily) that population mean is 10.5, find **probability of sample mean** as high as 11.6. If it's too improbable, we won't believe population mean is 10.5; we'll conclude there *is* bias in favor of higher numbers.

Example: Establishing Behavior of \bar{X}

- **Background:** We asked the following: “*The numbers 1 to 20 have mean 10.5, s.d. 5.8. If numbers picked ‘at random’ by 400 students have mean $\bar{x}=11.6$, does this suggest bias in favor of higher numbers?*”
- **Question:** What are the mean, standard deviation, and shape of the R.V. \bar{X} in this situation?
- **Response:** For $\mu=10.5$, $\sigma=5.8$, and $n=400$, \bar{X} has
 - mean _____
 - standard deviation _____
 - shape _____

Example: *Testing Assumption About μ*

- **Background:** Sample mean number picked at random from 1 to 20 by 400 students should have mean 10.5, s.d. 0.3.
- **Questions:** Is 11.6 improbably high for \bar{X} ? Does a sample mean of 11.6 convince us of bias in favor of higher numbers?
- **Responses:** 11.6 is _____ above _____, more than 3 s.d.s. The probability of being this high (or higher) is _____. Since this is extremely improbable, we _____ believe $\mu = 10.5$. Apparently, there _____ bias in favor of higher numbers.



Example: *Behavior of Individual vs. Mean*

- **Background:** IQ scores are normal with mean 100, s.d. 15.
- **Question:** Is 88 unusually low for...
 - IQ of a randomly chosen individual?
 - Mean IQ of 9 randomly chosen individuals?
- **Response:**
 - IQ X of a randomly chosen **individual** has mean 100, s.d. 15. For $x=88$, $z = \underline{\hspace{2cm}}$:
not even 1 s.d. below the mean $\rightarrow \underline{\hspace{2cm}}$
 - **Mean IQ \bar{X} of 9 randomly chosen individuals** has mean 100, s.d. $\underline{\hspace{2cm}}$. For $\bar{x}=88$, $z = \underline{\hspace{2cm}}$:
unusually low (happens less than $\underline{\hspace{2cm}}$ of the time, since $\underline{\hspace{2cm}}$).

Example: *Checking Assumptions*

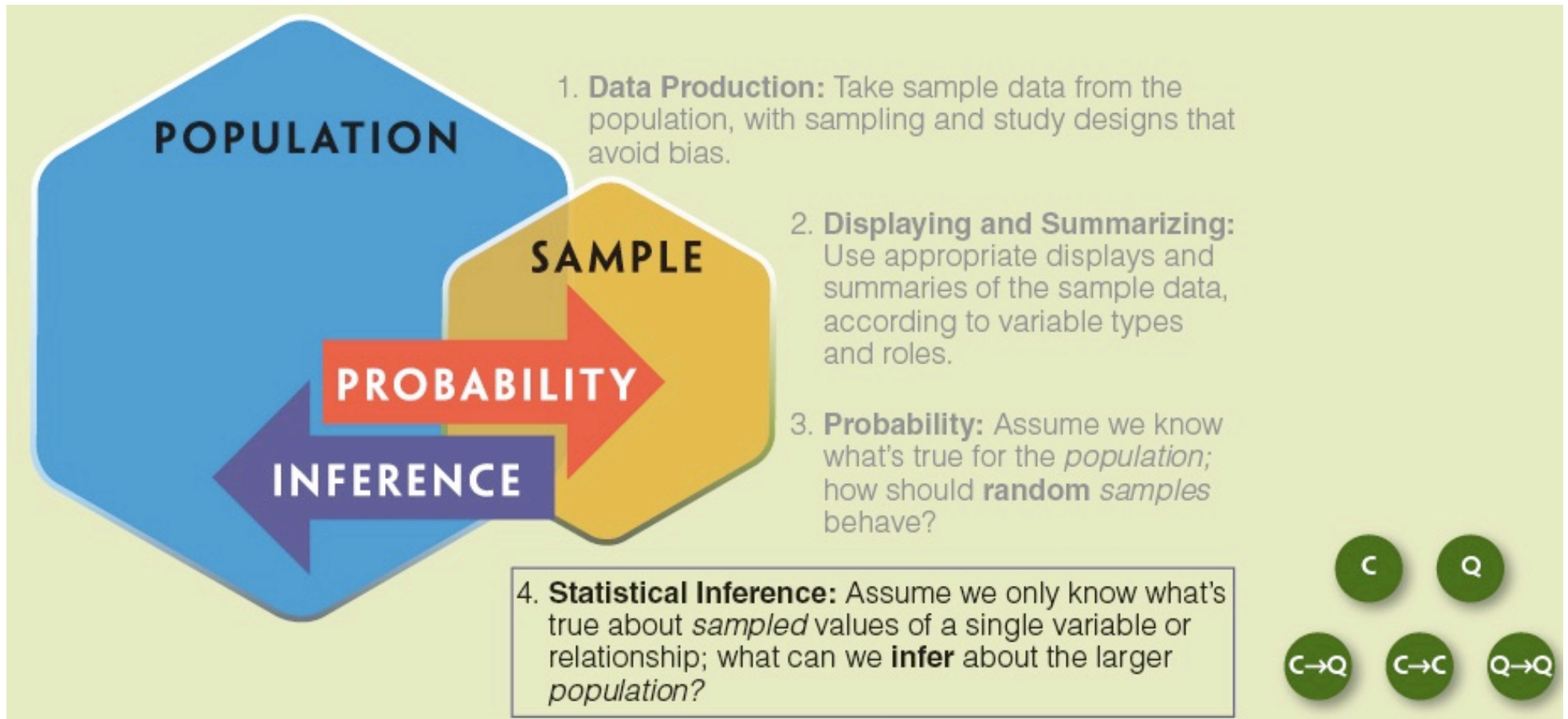
- **Background:** Household size X in the U.S. has mean 2.5, s.d. 1.4.
- **Question:** Is 3 unusually high for...
 - Size of a randomly chosen household?
 - Mean size of 10 randomly chosen households?
 - Mean size of 100 randomly chosen households?
- **Response:**
 - _____
 - _____
 - $n=100$ large $\rightarrow \bar{X}$ **normal**; mean 2.5, s.d. $\frac{1.4}{\sqrt{100}} = 0.14$
so $\bar{x} = 3$ has $z = (3-2.5)/0.14 = +3.57$: unusually high.

Looking Back: *Review*

□ 4 Stages of Statistics

- Data Production (discussed in Lectures 1-3)
- Displaying and Summarizing (Lectures 3-8)
- Probability (discussed in Lectures 9-13)
- Statistical Inference
 - 1 categorical
 - 1 quantitative
 - categorical and quantitative
 - 2 categorical
 - 2 quantitative

Four Processes of Statistics



Summarizing Categorical Sample Data (*Review*)

*What proportion of **sampl**ed students ate breakfast the day of the survey? $\hat{p} = \frac{X}{n} = \frac{246}{446} = 0.55$*

***Looking Back:** In Part 2, we summarized **sample** data for single variables or relationships.*

***Looking Ahead:** In Part 4, our goal is to go beyond sample data and draw conclusions about the larger **population** from which the sample was obtained.*



Three Types of Inference Problem

In a sample of 446 students, 0.55 ate breakfast.

1. What is our **best guess** for the population proportion of students who eat breakfast?

Point Estimate

2. What **interval** should contain the population proportion of students who eat breakfast?

Confidence Interval

3. Is the population proportion of students who eat breakfast **more than half (50%)**?

Hypothesis Test

Behavior of Sample Proportion (*Review*)

For random sample of size n from population with p in category of interest, sample proportion $\hat{p} = \frac{X}{n}$ has

- mean p

$\rightarrow \hat{p}$ is *unbiased estimator* of p

(sample must be random)

Example: *Checking if Estimator is Unbiased*

- **Background:** Survey produced sample proportion of intro stat students (various ages and times of day) at a university who'd eaten breakfast.
 - **Questions:**
 - Is the sample representative of *all* college students? All students at that university?
 - Were the values of the variable (breakfast or not) recorded without bias?
 - **Responses:**
 - Differences among college cafeterias, etc.→
-
- Question not sensitive→
-

Example: *Point Estimate for p*

- **Background:** In a representative sample of students, 0.55 ate breakfast.
- **Question:** What is our best guess for the proportion of all students at that university who eat breakfast?
- **Response:** \hat{p} unbiased estimator for $p \rightarrow$
_____ is best guess for p

Example: *Point Estimate Inadequate*

- **Background:** Our best guess for p , population proportion eating breakfast, is sample proportion 0.55.
- **Questions:**
 - Are we pretty sure the population proportion is 0.55?
 - By approximately what amount is our guess “off”?
 - Are we pretty sure population proportion is > 0.50 ?
- **Responses:**
 - _____
 - _____
 - _____

Three Types of Inference Problem

In a sample of 446 students, 0.55 ate breakfast.

1. What is our **best guess** for the population proportion of students who eat breakfast?

Point Estimate

2. What **interval** should contain the population proportion of students who eat breakfast?

Confidence Interval

3. Do **more than half** (50%) of the population of students eat breakfast?

Hypothesis Test

Beyond a Point Estimate

Sample proportion from unbiased sample is best estimate for population proportion.

*Looking Ahead: For point estimate we don't need **sample size** or info about **spread**. These are required for **confidence intervals** and hypothesis tests, to quantify how good our point estimate is.*

Probability vs. Confidence



- **Probability:** given population proportion, how does sample proportion behave?
- **Confidence:** given sample proportion, what is a range of plausible values for population proportion?

Turning Point!

Example: *Probability Statement*

- **Background:** If students pick numbers from 1 to 20 at random, $p=0.05$ should pick #7. For $n=400$, \hat{p} has
 - mean 0.05
 - standard deviation $\sqrt{\frac{0.05(1-0.05)}{400}} = 0.01$
 - shape approximately normal
- **Question:** What does the “95” part of the 68-95-99.7 Rule tell us about \hat{p} ?
- **Response:** Probability is approximately 0.95 that \hat{p} falls within _____ of _____.

*Looking Ahead: This statement about **sample proportion** is correct but not very useful for practical purposes. In most real-life problems, we want to draw conclusions about an **unknown population proportion**.*

Example: *How Far is One from the Other?*

- **Background:** An instructor can say about his/her position in the classroom:
“I’m within 10 feet of this particular student.”
- **Question:** What can be said about where that student is in relation to the instructor?
- **Response:**

Definitions

Margin of Error: *Distance* around a sample statistic, within which we have reason to believe the corresponding parameter falls.

A common margin of error is 2 s.d.s.

Confidence Interval for parameter: *Interval* within which we have reason to believe the parameter falls = **range of plausible values**

A common confidence interval is sample statistic plus or minus 2 s.d.s.

A Closer Look: *A parameter is **not** a R.V. It does **not** obey the laws of probability so we must use the word “confidence”.*

Example: *Confidence Interval for p*

- **Background:** $30/400=0.075$ students picked #7 “at random” from 1 to 20. Let’s assume sample proportion for $n=400$ has s.d. 0.01 .
- **Question:** What can we claim about population proportion p picking #7?
- **Response:** We’re pretty sure p is

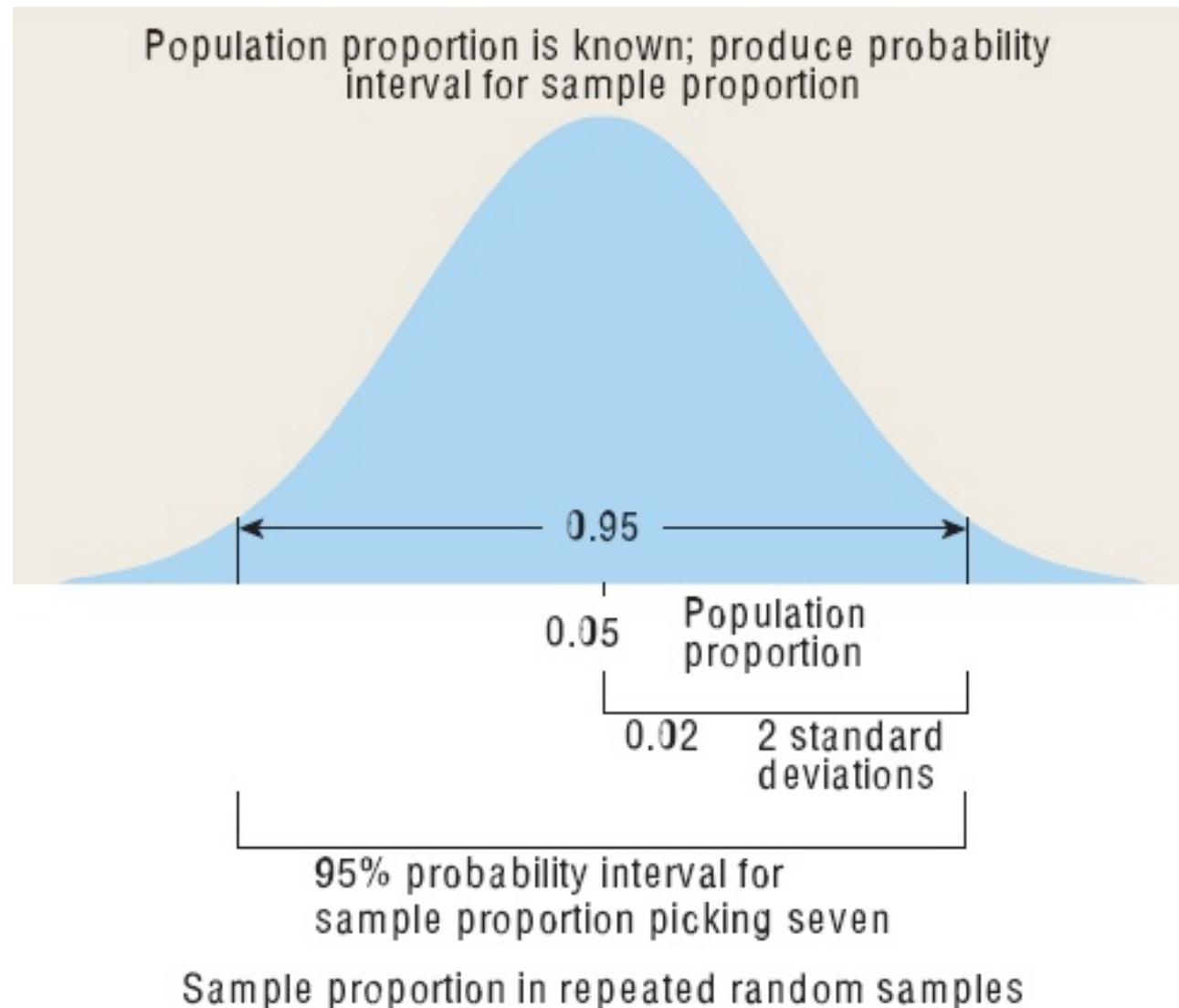
Looking Back: In Part I, we learned about biased samples. The data suggest $p > 0.05$: students were apparently biased in favor of #7. Their selections were **haphazard**, not random. If sampling individuals or assigning them to experimental treatments is **not randomized**, then we produce a confidence interval that is **not** centered at p .

Level of Confidence Corresponds to Multiplier

By “pretty sure”, we mean “95% confident”, because 95% is the probability of sample proportion within 2 s.d.s of p (for large enough n).

***Looking Back:** Our probability statement claimed sample proportion should fall within 2 s.d.s of population proportion. Now, the inference statement claims population proportion should be within 2 s.d.s of sample proportion.*

Probability Interval for \hat{p} Picking #7



Confidence Interval for p Picking #7

*We do not sketch a curve showing probabilities for population proportion because it is **not a random variable**.*

Measure sample proportion; produce confidence interval for unknown population proportion

Sample proportion in one random sample

0.02 = margin of error

95% confidence interval for population proportion picking seven
Unknown population proportion

A Closer Look:
How do we know the margin of error?

Behavior of Sample Proportion (*Review*)

For random sample of size n from population with p in category of interest, sample proportion \hat{p} has

- mean p

- standard deviation $\sqrt{\frac{p(1-p)}{n}}$

We do inference because p is unknown; how can we know the standard deviation, which involves p ?

Definition

Standard error: estimated standard deviation of a sampling distribution.

We estimate standard deviation of \hat{p} with standard error $\sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$.

***Looking Ahead:** In many situations throughout inference, when needed information about the **population** is unknown, we substitute known information about the **sample**.*

Definition

95% confidence interval for p : (approx.)

$$\boxed{\hat{p}} \pm 2 \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$$

estimate= sample proportion

standard error

margin of error =
2 standard errors

**95% confidence interval
for population proportion**

Confidence Interval Formula: Conditions

95% confidence interval for p : (approx.)

$$\hat{p} \pm 2 \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$$

- Sample must be unbiased
(otherwise interval is not really centered at \hat{p})
- n must be large enough so \hat{p} is approx. normal
(otherwise multiplier 2 from 68-95-99.7 Rule is incorrect)
- Population size must be at least $10n$
(otherwise formula for s.d., which requires independence, is incorrect)

Conditions for Normality in Confidence Interval

Multiplier 2 from normal dist. approximately correct if np and $n(1-p)$ both at least 10.

But p is unknown so substitute \hat{p} :

Require

$$n\hat{p} = nX/n = X \geq 10$$

$$n(1 - \hat{p}) = n - nX/n = n - X \geq 10$$

Sample count in (X) and out ($n-X$) of category of interest should both be at least 10.

Example: *Checking Sample Size*

- **Background:** $30/400=0.075$ students picked #7 “at random” from 1 to 20.
- **Question:** Do the data satisfy requirement for approximate normality of sample proportion?
- **Response:**

Example: *Checking Population Size*

- **Background:** To draw conclusions about criminal histories of a city's 750 bus drivers, a random sample of 100 drivers was used.
- **Question:** Is there approximate independence in spite of sampling without replacement, so formula for standard error is accurate?
- **Response:**

Example: *Revisiting Original Question*

- **Background:** In sample of 446 college students, 246 (proportion 0.55) ate breakfast.
- **Question:** Assuming sample is representative, what interval should contain proportion of all students at that university who eat breakfast?
- **Response:** Approx. 95% confidence interval for p is

Looking Back:

Earlier we wondered if a majority of students eat breakfast. The interval suggests this is the case, since it is entirely above 0.50.

$$\hat{p} \pm 2\sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$$

Example: *Role of Sample Size*

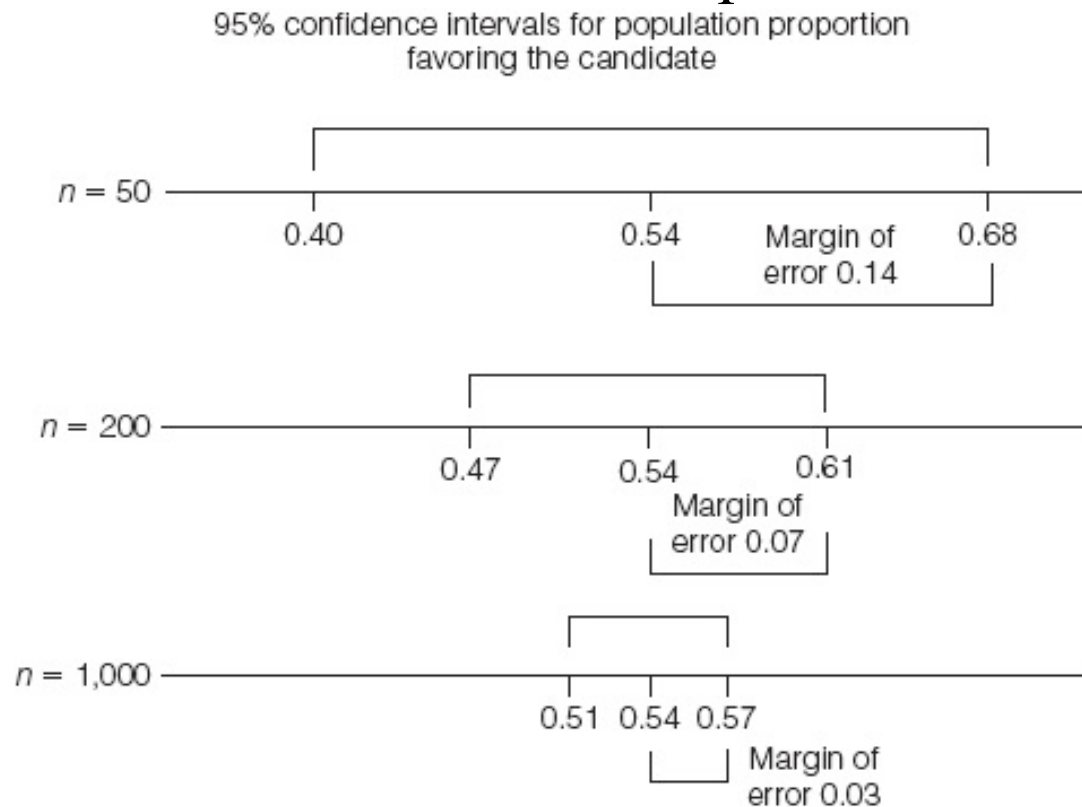
- **Background:** 95% confidence intervals based on sample proportion 0.54 from various sample sizes:

Sample Size n	Standard Error of \hat{p}	Margin of Error	95% Confidence Interval
50	$\sqrt{\frac{0.54(1 - 0.54)}{50}} = 0.070$	$2(0.070) = 0.14$	(0.40, 0.68)
200	$\sqrt{\frac{0.54(1 - 0.54)}{200}} = 0.035$	$2(0.035) = 0.07$	(0.47, 0.61)
1,000	$\sqrt{\frac{0.54(1 - 0.54)}{1,000}} = 0.016$	$2(0.016) = 0.03$	(0.51, 0.57)

- **Question:** What happens as n increases?
- **Response:**

Example: *A Common Margin of Error*

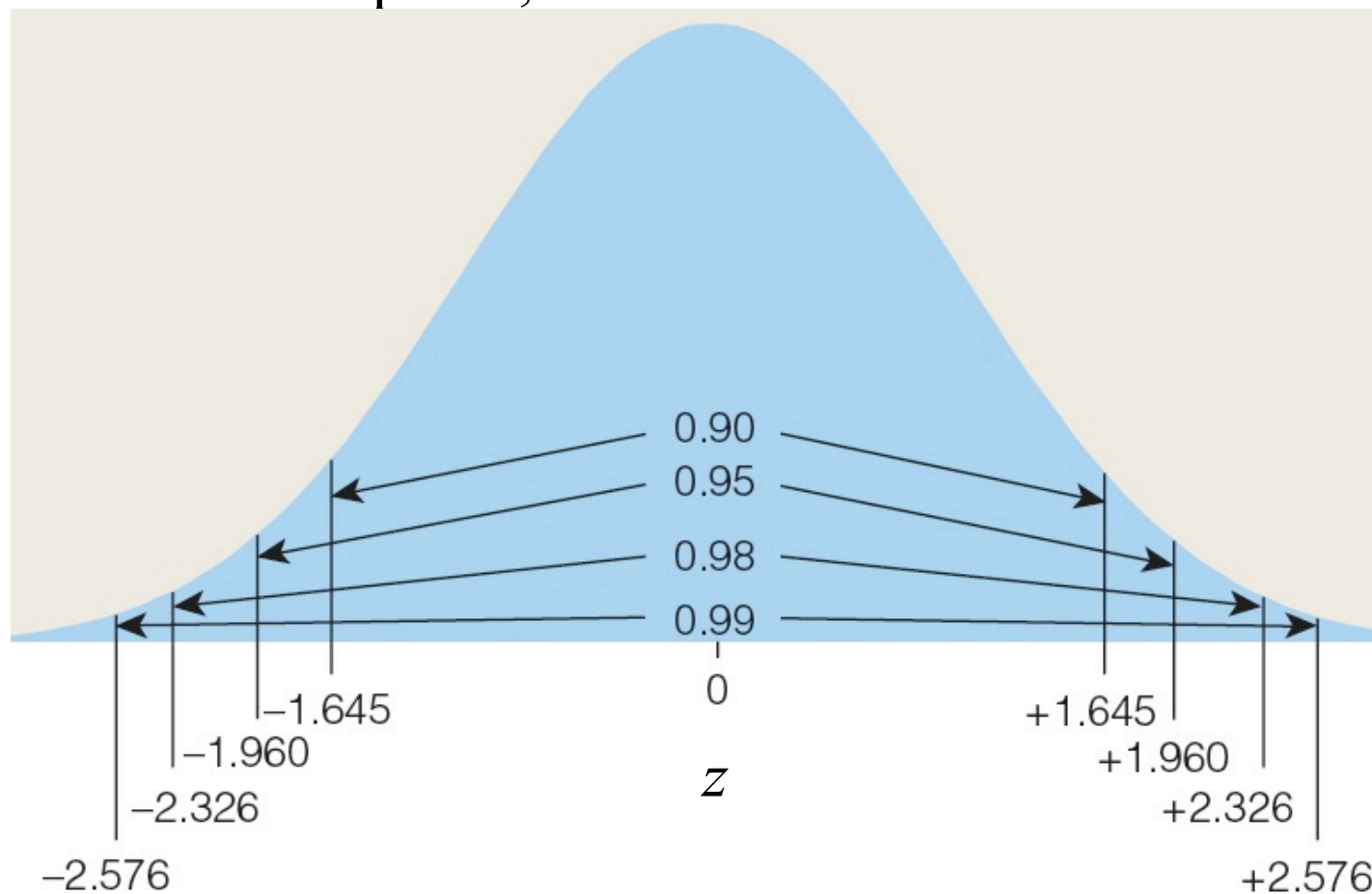
- **Background:** Pollsters most often report a 3% error margin.



- **Question:** What is the most common sample size for polls?
- **Response:** Approximately _____.

Other Levels of Confidence

Confidence level 95% uses multiplier 2. Other levels use other multipliers, based on normal curve:



Other Levels of Confidence

Confidence level 95% uses multiplier 2. Other levels use other multipliers, based on normal curve.

More precise multiplier for 95% is 1.96 instead of 2.

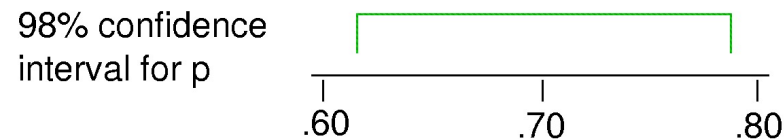
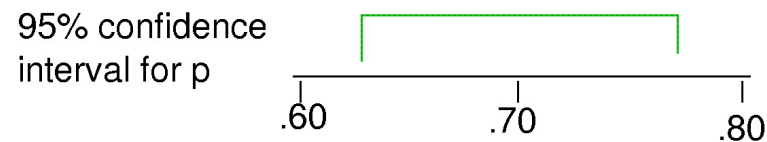
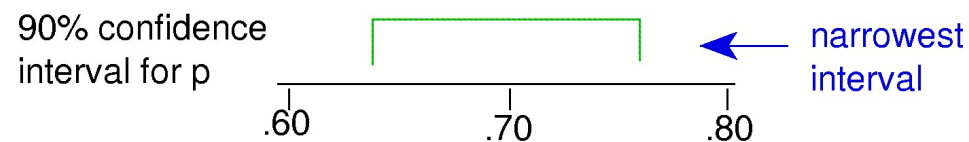
Level	Multiplier
90%	1.645
95%	1.960
98%	2.326
99%	2.576

Example: *Other Levels of Confidence*

- **Background:** Of 108 students in committed relationships, 0.70 said they took comfort by sniffing out-of-town partner's clothing. Standard error can be found to be 0.04.
- **Question:** How do 90%, 95%, 98%, 99% confidence intervals compare?
- **Response:**
 - 90% C.I. is _____ $= (0.63, 0.77)$
 - 95% C.I. is _____ $= (0.62, 0.78)$
 - 98% C.I. is _____ $= (0.61, 0.79)$
 - 99% C.I. is _____ $= (0.60, 0.80)$

Example: *Other Levels of Confidence*

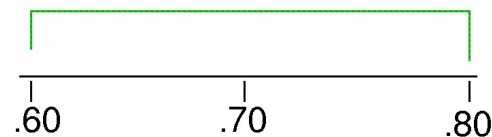
Intervals get _____ as confidence level increases:



highest level
of confidence



99% confidence interval for p



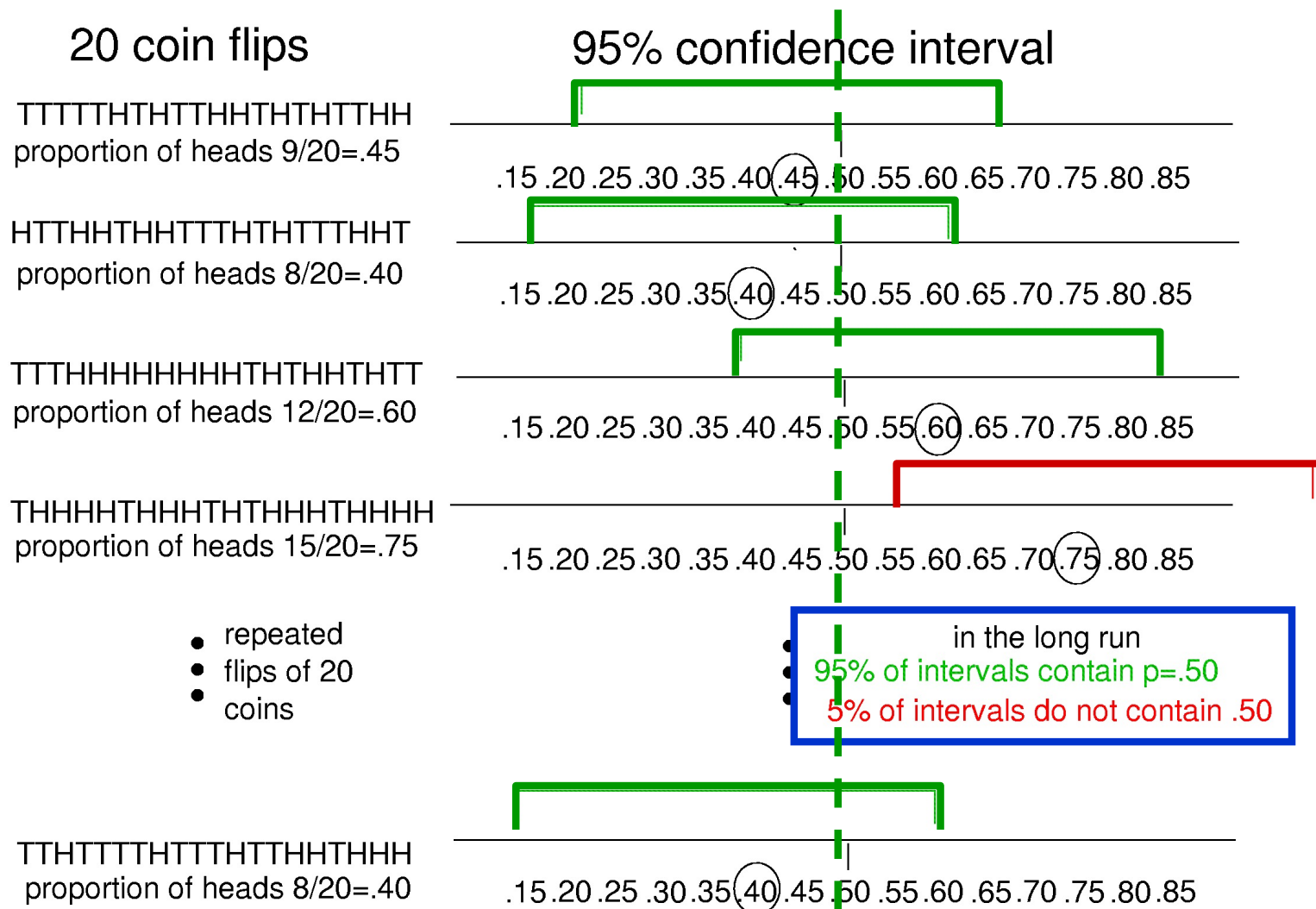


Confidence Interval and Long-Run Behavior

Repeatedly set up 95% confidence interval for proportion of heads, based on 20 coinflips.

In the long run, 95% of the intervals should contain population proportion of heads, 0.5.

Confidence Interval and Long-Run Behavior



Example: *Confidence in the Long Run*

- **Background:** “President-elect Barack Obama's campaign strategists weren't the only ones vindicated Tuesday. Pollsters came out looking pretty good, too. Of **27** polls of Pennsylvania voters released in the campaign's final two weeks, only **seven** missed Obama's 10.3-point victory by more than their margins of error. Obama's national victory of about 6 points was within the error margins of **16 of the 21** national polls released in the final week.”
- **Question:** Should pollsters be pleased with success rates of $20/27 = 16/21 = 75\%$?
- **Response:**

pittsburghlive.com/x/pittsburghtrib/news/cityregion/s_597288.html

Lecture Summary

(Sampling Distributions; Means)

- 68-95-99.7 Rule for sample mean
 - Revisit typical problem
 - Checking assumptions for use of Rule

Lecture Summary

(Inference for Proportions: Confidence Interval)

- 3 forms of inference; focus on confidence interval
- Probability vs. confidence
- Constructing confidence interval
 - Margin of error based on standard error
 - Conditions
- Role of sample size
- Confidence at other levels
- Confidence interval in the long run