

# Lecture 15: Chapter 9, Section 2

## Inference for Categorical Variable: Hypothesis Tests

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- 4 steps in Hypothesis Test; Posing Hypotheses
- Details of 4 Steps, Definitions and Notation
- 3 Forms of Alternative Hypothesis
- $P$ -Value
- Example with “Greater Than” Alternative
- 3 Forms of Alternative; Effect on Conclusion
- Small  $P$ -values and Statistical Significance

# Looking Back: *Review*

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## □ 4 Stages of Statistics

- Data Production (discussed in Lectures 1-3)
- Displaying and Summarizing (Lectures 3-8)
- Probability (discussed in Lectures 9-14)
- Statistical Inference
  - 1 categorical: conf. ints. (L14), hypothesis tests
  - 1 quantitative
  - categorical and quantitative
  - 2 categorical
  - 2 quantitative

# Three Types of Inference Problem (*Review*)

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*In a sample of 446 students, 0.55 ate breakfast.*

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

## **Point Estimate**

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

## **Confidence Interval**

3. Do more than half (50%) of all students eat breakfast?

## **Hypothesis Test**

## 4 Steps in Hypothesis Test About $p$

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(First pose question as choice between 2 opposing views about  $p$ .)

1. Check data production for bias, etc.
2. We summarize with  $\hat{p}$ , standardize to  $z$ .
3. Find probability of  $\hat{p}$  this extreme.
4. Perform inference, drawing conclusions about population proportion  $p$ .

These correspond to 4 Processes of Statistics.

## Example: *Posing Hypothesis Test Question*

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- **Background:** In a sample of 446 students, 0.55 ate breakfast. Do more than half of all students at that university eat breakfast?
- **Question:** How can we pose above question as two opposing points of view about  $p$ ?
- **Response:**

## 4 Steps in Hypothesis Test About $p$

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(First pose question as choice between 2 opposing views about  $p$ .)

1. Check data production for bias.
2. We summarize with  $\hat{p}$ , standardize to  $z$ .
3. Find probability of  $\hat{p}$  this extreme.
4. Perform inference, drawing conclusions about population proportion  $p$ .

# Example: *Considering Data Production*

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- **Background:** In a sample of 446 college students, 0.55 ate breakfast. We want to draw conclusions about breakfast habits of all students at that university.
- **Question:** What data production issues should be considered?
- **Response:** (discussed with confidence intervals)
  - **Sampling:** \_\_\_\_\_
  - **Study design:** \_\_\_\_\_

} (for claims about \_\_\_\_\_)

Also, (for claims about \_\_\_\_\_) is population  $\geq 10n$ ?

And (for claims about \_\_\_\_\_) is  $n$  large enough?

## 4 Steps in Hypothesis Test About $p$

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(First pose question as choice between 2 opposing views about  $p$ .)

1. Check data production for bias.
2. We summarize with  $\hat{p}$ , standardize to  $z$ .
3. Find probability of  $\hat{p}$  this extreme.
4. Perform inference, drawing conclusions about population proportion  $p$ .



# Behavior of Sample Proportion (*Review*)

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

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

Hypothesis test: assume pop. proportion  $p$  is proposed value (=0.50 for breakfast example).

***Looking Back:*** For confidence intervals, we had to substitute sample proportion for unknown  $p$ .

## Example: *Summarizing and Standardizing*

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- **Background:** In a sample of 446 students, 0.55 ate breakfast. Do more than half (0.50) of all students at that university eat breakfast?
- **Question:** How do we summarize the data?
- **Response:** Summarize with \_\_\_\_\_.  
Standardize to

So 0.55 is \_\_\_\_\_ standard deviations above 0.50:  
pretty unusual.

## 4 Steps in Hypothesis Test About $p$

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(First pose question as choice between 2 opposing views about  $p$ .)

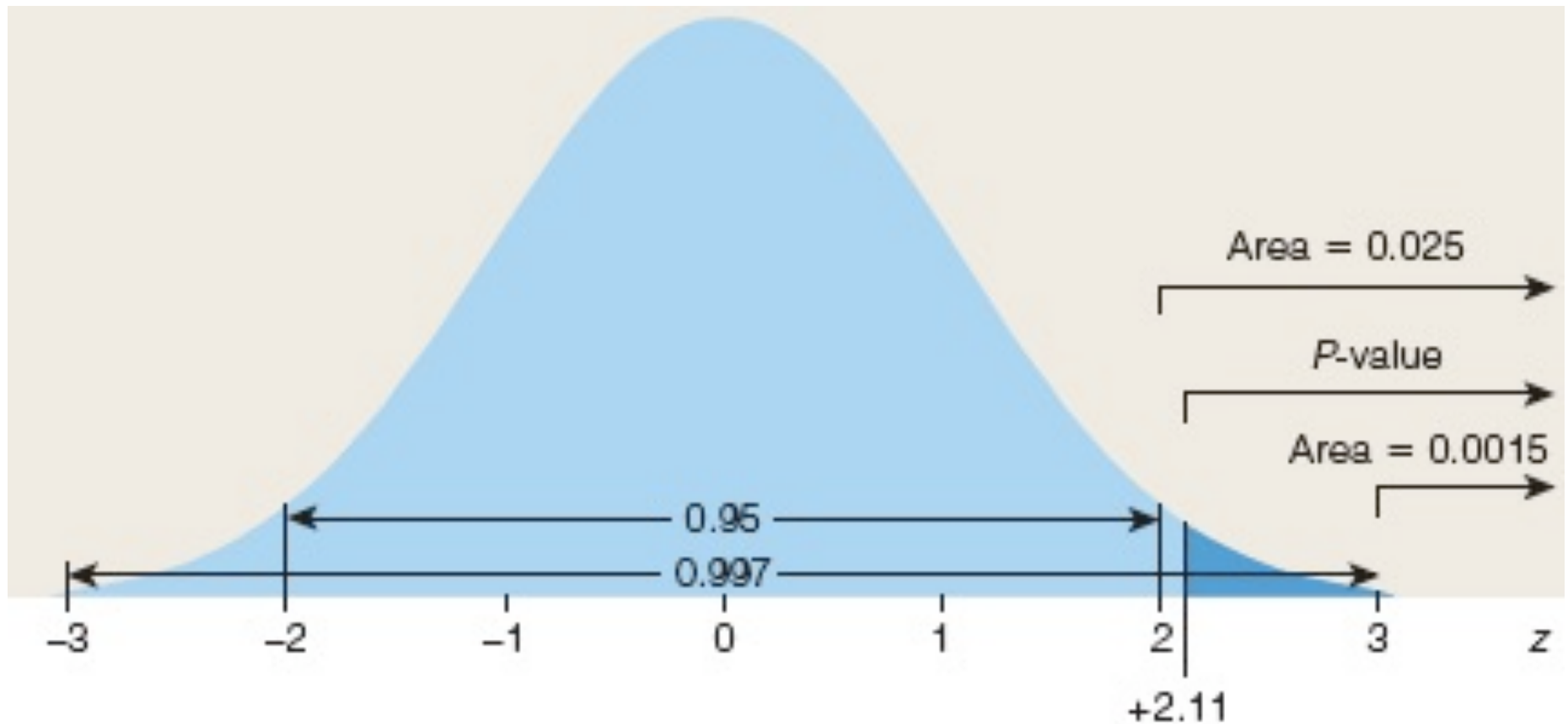
1. Check data production for bias.
2. We summarize with  $\hat{p}$ , standardize to  $z$ .
3. Find probability of  $\hat{p}$  this extreme.
4. Perform inference, drawing conclusions about population proportion  $p$ .

## Example: *Estimating Relevant Probability*

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- **Background:** In a sample of 446 students, 0.55 ate breakfast. Do more than half of all students eat breakfast? We summarized with  $\hat{p} = 0.55$  and  $z = \frac{0.55 - 0.50}{\sqrt{\frac{0.50(1-0.50)}{446}}} = +2.11$
- **Question:** If  $p=0.50$ , how unlikely is it to get  $\hat{p}$  as high as 0.55 (that is, for  $z$  to be  $\geq +2.11$ )?
- **Response:** 68-95-99.7 Rule  $\rightarrow$  since  $2.11 > 2$ ,  $P(Z \geq +2.11)$  is \_\_\_\_\_  
Such a probability can be considered to be \_\_\_\_\_.

# Illustration of Relevant Probability



***Looking Ahead:*** The relevant probability for testing a hypothesis will be defined as the ***P-value***.

## 4 Steps in Hypothesis Test About $p$

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(First pose question as choice between 2 opposing views about  $p$ .)

1. Check data production for bias.
2. We summarize with  $\hat{p}$ , standardize to  $z$ .
3. Find probability of  $\hat{p}$  this extreme.
4. Perform inference, drawing conclusions about population proportion  $p$ .

## Example: *Drawing Conclusions About $p$*

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- **Background:** In a sample of 446 students, 0.55 ate breakfast. Do more than half of all students eat breakfast? We summarized with  $\hat{p} = 0.55$  and  $z = \frac{0.55 - 0.50}{\sqrt{\frac{0.50(1 - 0.50)}{446}}} = +2.11$

The probability of  $z$  being **+2.11** or higher is less than  $(1 - 0.95) \div 2 =$  **0.025** (fairly unlikely).

- **Question:** What do we conclude about  $p$ ?
- **Response:**

## Hypothesis Test About $p$ (*More Details*)

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First state 2 opposing views about  $p$ , called null and alternative hypotheses  $H_o$  and  $H_a$ .

1. Consider sampling and study design as for C.I.
2. Summarize with  $\hat{p}$ ; does it tend in the suspected direction? Standardize to  $z$ , assuming  $p = p_o$  ( $p_o$  is proposed value); consider if  $z$  is “large”.
3. Find prob. of  $\hat{p}$  this high/low/different, called ‘ $P$ -value’ of the test; consider if it is “small”.
4. Draw conclusions about  $p$ : choose between null and alternative hypotheses. (Statistical Inference)



# Definitions

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- **Null hypothesis**  $H_o$  : claim that parameter equals proposed value.
- **Alternative hypothesis**  $H_a$  : claim that parameter differs in some way from proposed value.
- **P-value:** probability, assuming  $H_o$  is true, of obtaining sample data at least as extreme as what has been observed.

***Looking Back:** We considered the **probability**, assuming  $p=0.5$  cards are red, of getting as few as 0 red cards in 4 or 5 picks.*

# Notation

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Proposed value of population proportion:  $p_0$

Null and alternative hypotheses in test about unknown population proportion:

$$H_0 : p = p_0 \quad \text{vs.} \quad H_a : \left\{ \begin{array}{l} p > p_0 \\ p < p_0 \\ p \neq p_0 \end{array} \right\}$$

***Looking Ahead:*** The form of the alternative hypothesis will affect Steps 2, 3, 4 of the test.

# Example: *What Are We Testing About?*

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- **Background:** Consider 3 problems:
  - $30/400=0.075$  students picked #7 “at random” from 1 to 20. Is this evidence of bias for #7?
  - Do fewer than half of commuters walk? 111/230 of surveyed commuters at a university walked.
  - % disadvantaged in Florida community colleges is 43%. Is Florida Keys College unusual with 47.5% disadvantaged?
- **Question:** In each case, are we trying to draw conclusions about a sample proportion  $\hat{p}$  or a population proportion  $p$ ?
- **Response:** \_\_\_\_\_

*Looking Ahead: We'll refer to sample proportion later, to decide which of two claims to believe about the unknown population proportion.*

# Example: *Three Forms of Alternative*

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- **Background:** Consider 3 problems:
  - $30/400=0.075$  students picked #7 “at random” from 1 to 20. Is this evidence of bias for #7?
  - Do fewer than half of commuters walk? 111/230 of surveyed commuters at a university walked.
  - % disadvantaged in Florida community colleges is 43%. Is Florida Keys College unusual with 47.5% disadvantaged?
- **Question:** How do we write the hypotheses in each case?
- **Response:**
  - \_\_\_\_\_
  - \_\_\_\_\_
  - \_\_\_\_\_

# Definitions

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- **One-sided alternative hypothesis** refutes equality with  $>$  or  $<$  sign
- **Two-sided alternative hypothesis** features a not-equal sign

**Note:** For a one-sided alternative, sometimes the accompanying null hypothesis is written as a (not strict) inequality. Either way, the same conclusions will be reached.



## Assessing Merit of Data in One-Sided Test

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If sample proportion does not tend in the direction claimed by alternative hypothesis in a 1-sided test, there is no need to proceed further.

## Example: *When Test Can Be Cut Short*

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- **Background:** The moon has four phases: new moon, first quarter, full moon, and last quarter, each in effect for 25% of the time. A neurologist whose patients claimed their seizures tended to be triggered by a full moon found 20% of 470 seizures were at full moon.
- **Question:** Do we need to carry out all 4 steps in the test?
- **Response:**

## How to Assess $P$ -Value

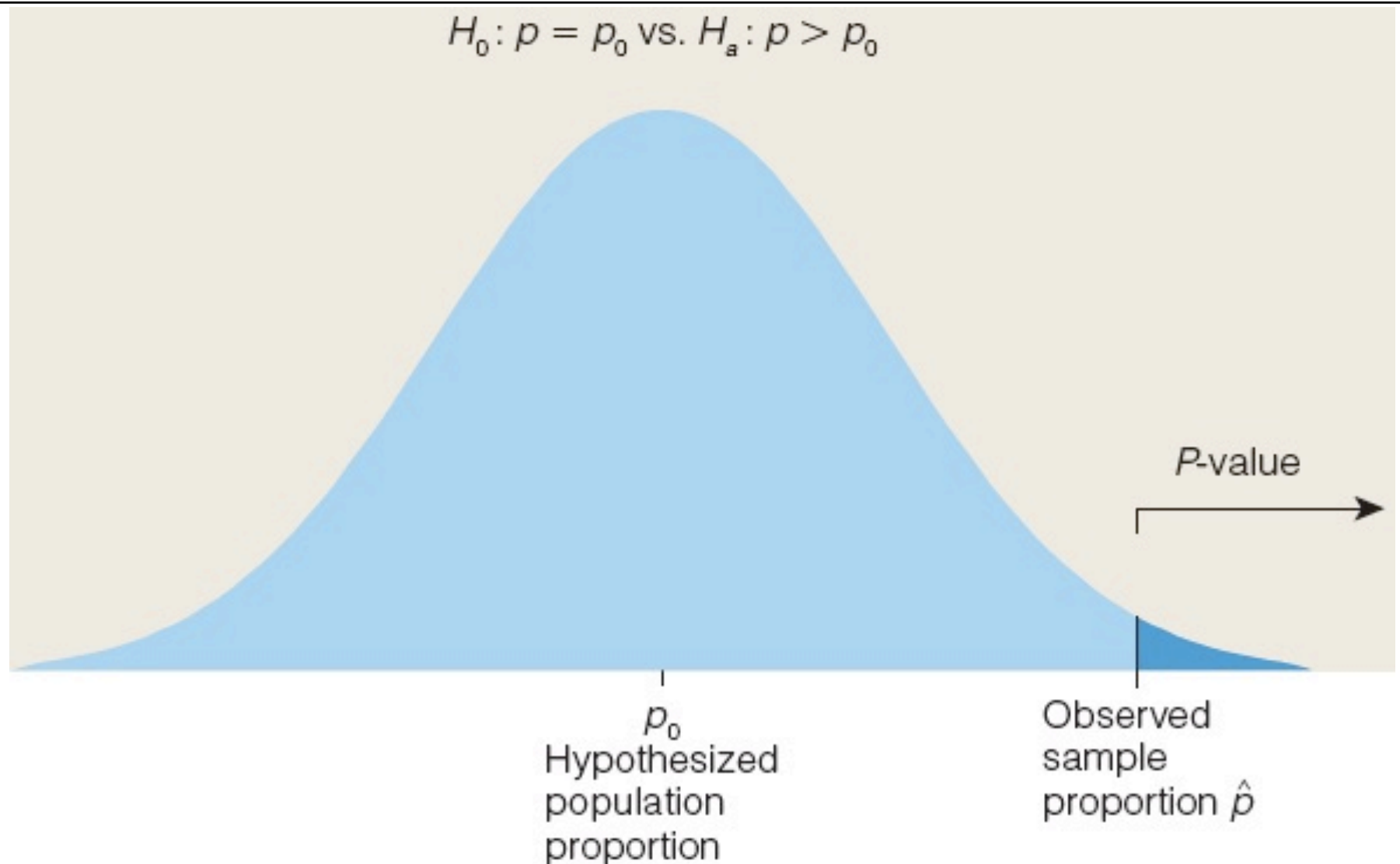
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**$P$ -value:** probability, assuming  $H_o$  is true, of obtaining sample data **at least as extreme** as what has been observed. How to find  $P$ -value depends on form of alternative hypothesis:

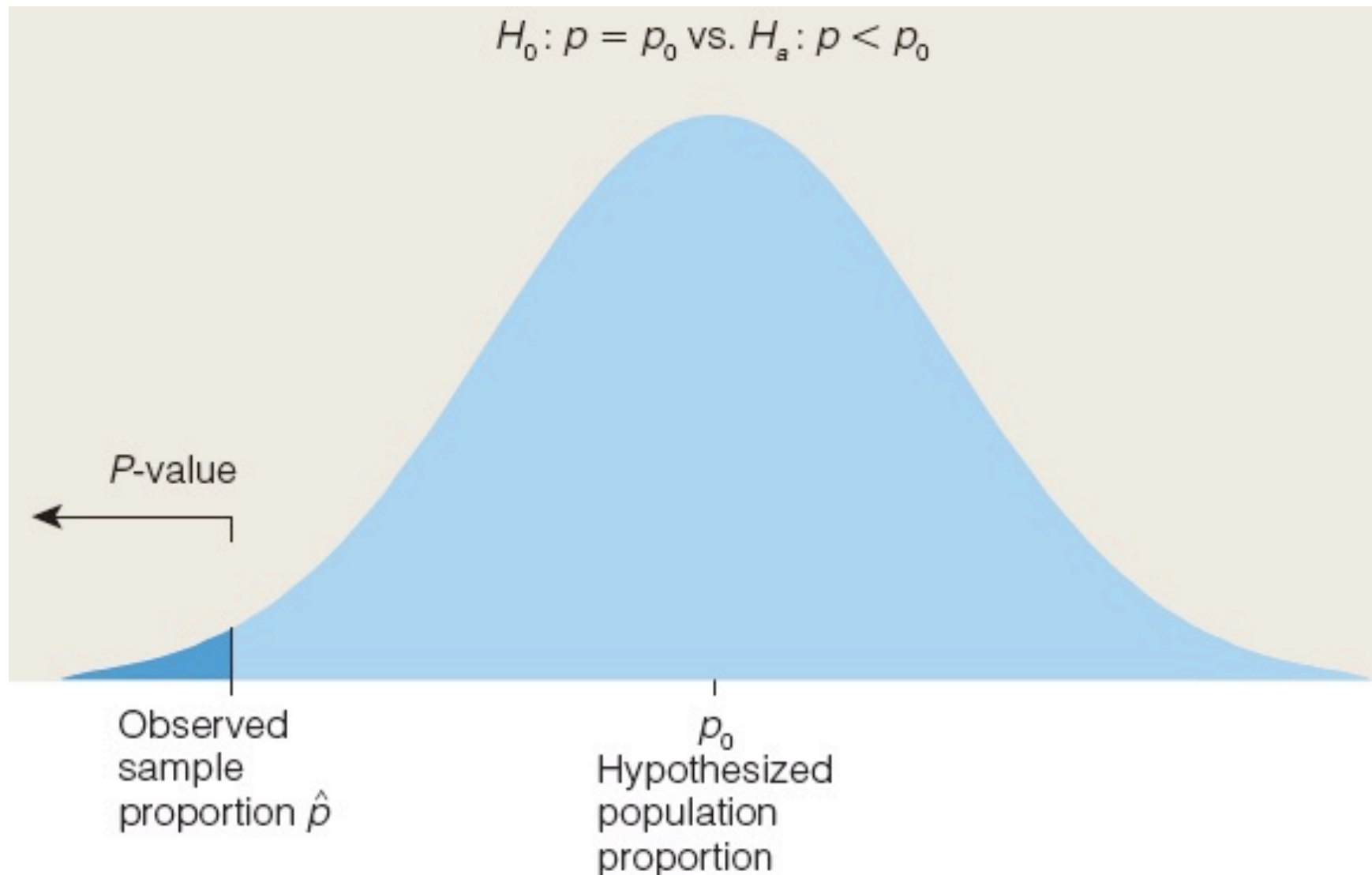
- **Right-tailed probability** for  $H_a : p > p_o$
- **Left-tailed probability** for  $H_a : p < p_o$
- **Two-tailed probability** for  $H_a : p \neq p_o$



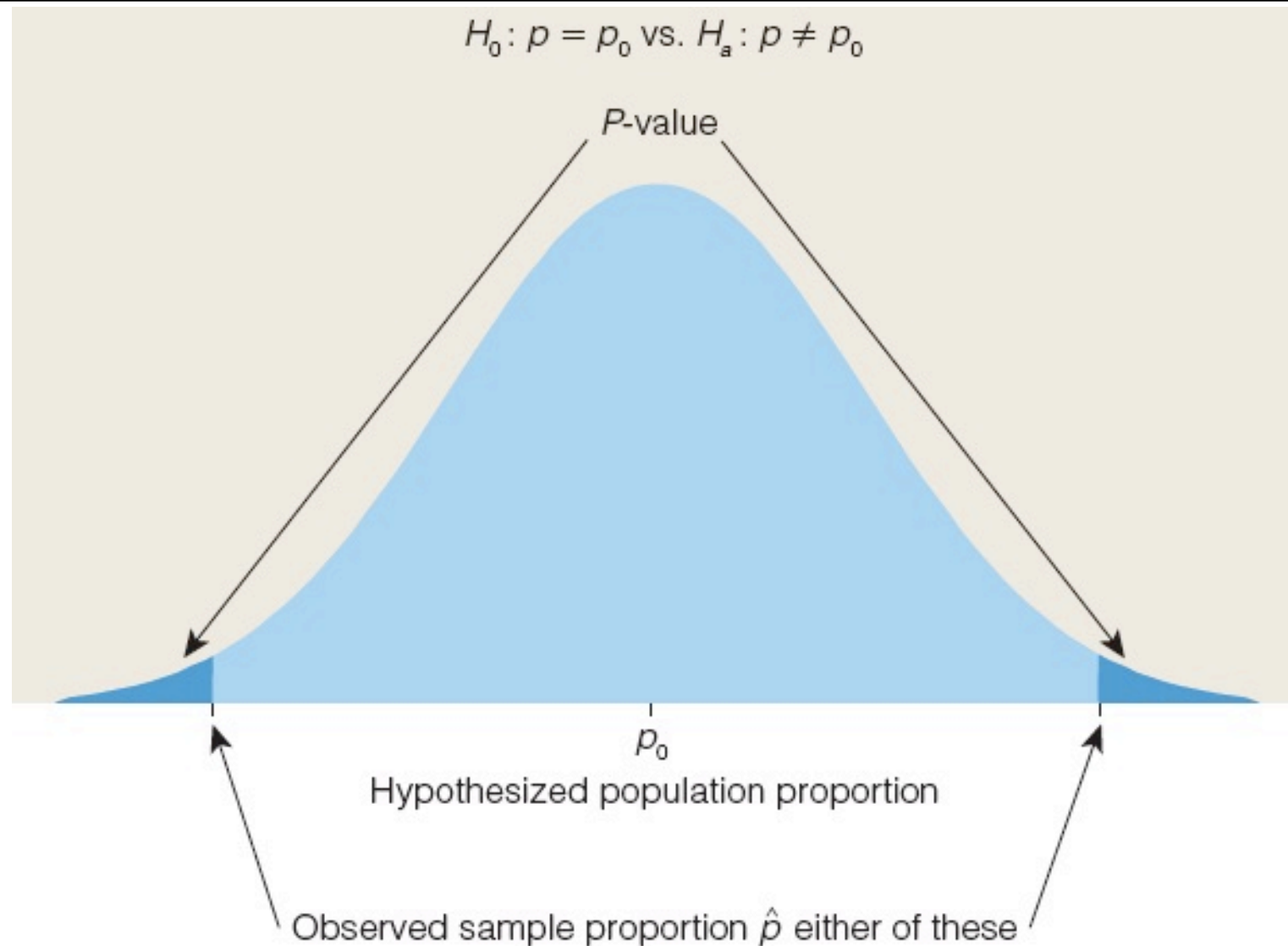
$P$ -Value for  $H_a : p > p_0$  is Right-tailed Probability



$P$ -Value for  $H_a : p < p_0$  is Left-tailed Probability



# $P$ -Value for $H_a : p \neq p_0$ is Two-tailed Probability



# Drawing Correct Conclusions

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Two possible conclusions:

- $P$ -value small  $\rightarrow$  reject  $H_0 \rightarrow$  conclude  $H_a$ .  
State we have evidence in favor of  $H_a$ .  
(**not** same as **proving**  $H_a$  true and  $H_0$  false).
- $P$ -value not small  $\rightarrow$  don't reject  $H_0$   
 $\rightarrow$  conclude  $H_0$  may be true.  
(**not** same as **proving**  $H_0$  true and  $H_a$  false)

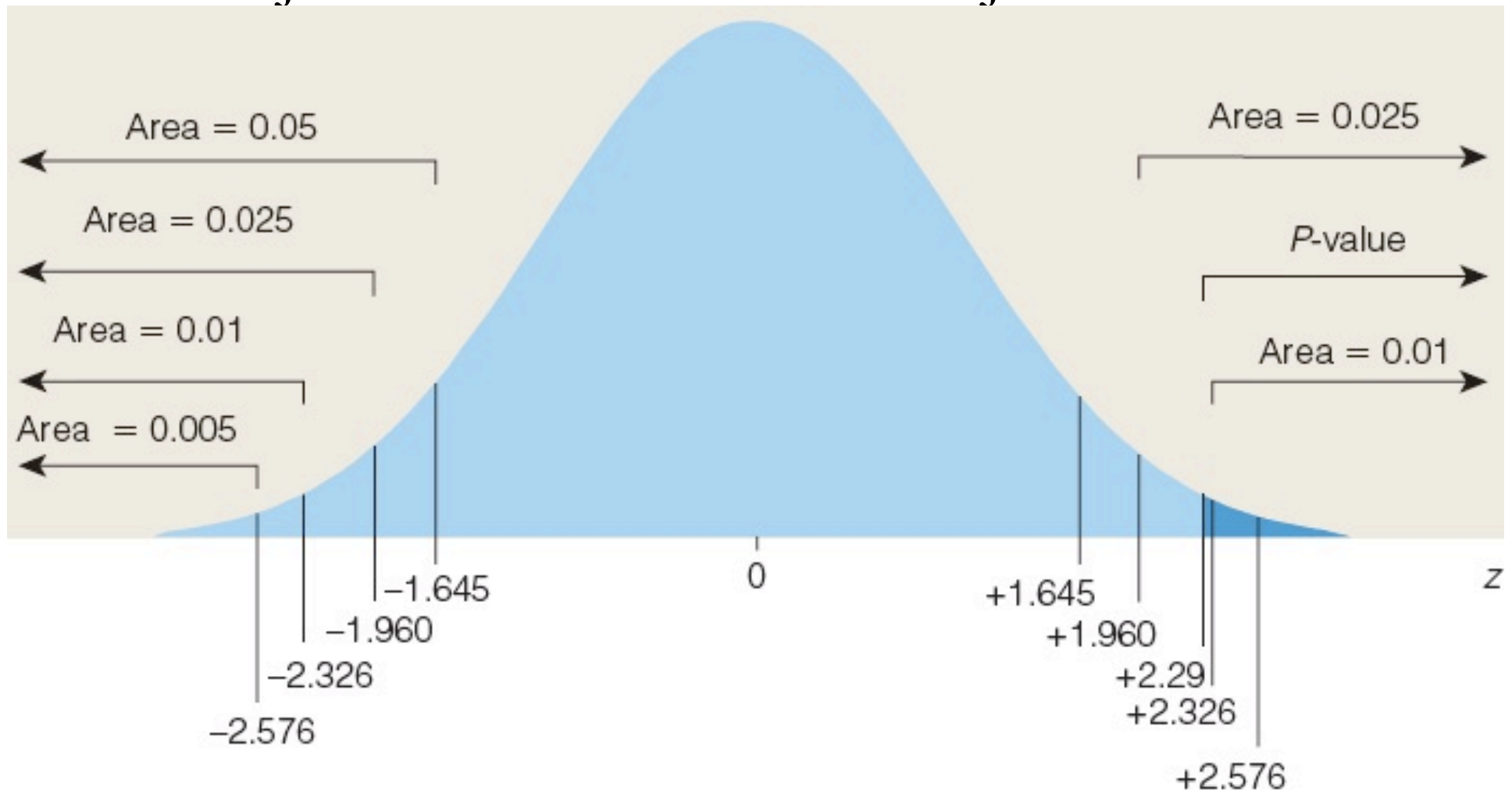
## Example: Test with “Greater Than” Alternative

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- **Background:**  $30/400=0.075$  students picked #7 “at random” from 1 to 20.
- **Question:** In general, is  $p>0.05$ ? (evidence of bias?)
- **Response:** First write  $H_o$ : \_\_\_\_\_ vs.  $H_a$ : \_\_\_\_\_
  1. Students are “typical” humans; bias is issue at hand.
  2.  $0.075 > 0.05$  so the *sample* did favor #7. If  $p = 0.05$ ,  $\hat{p}$  standardizes to  $z =$
  3.  $P$ -value = \_\_\_\_\_
  4. Reject  $H_o$ ? \_\_\_\_\_ Conclude? \_\_\_\_\_

# Assessing a $P$ -value with 90-95-98-99 Rule

2.29 just under 2.326  $\rightarrow$   $P$ -value just over 0.01



# Three Types of Inference Problem (*Review*)

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*In a sample of 446 students, 0.55 ate breakfast.*

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

## **Point Estimate**

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

## **Confidence Interval**

3. Do more than half (50%) of all students eat breakfast?

## **Hypothesis Test**

## Hypothesis Test About $p$ (Review)

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State null and alternative hypotheses  $H_0$  and  $H_a$ :

Null is “status quo”, alternative “rocks the boat”.

$$H_0 : p = p_0 \quad \text{vs.} \quad H_a : \left\{ \begin{array}{l} p > p_0 \\ p < p_0 \\ p \neq p_0 \end{array} \right\}$$

1. Consider sampling and study design.
2. Summarize with  $\hat{p}$ , standardize to  $z$ , assuming that  $H_0 : p = p_0$  is true; consider if  $z$  is “large”.
3. Find  $P$ -value=prob.of  $z$  this far above/below/away from 0; consider if it is “small”.
4. Based on size of  $P$ -value, choose  $H_0$  or  $H_a$ .



# Checking Sample Size: C.I. vs. Test

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- Confidence Interval: Require **observed** counts in and out of category of interest to be at least 10.

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

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

- Hypothesis Test: Require **expected** counts in and out of category of interest to be at least 10 (assume  $p = p_0$ ).

$$np_0 \geq 10$$

$$n(1 - p_0) \geq 10$$

## Example: *Checking Sample Size in Test*

- **Background:**  $30/400=0.075$  students picked #7 “at random” from 1 to 20. Want to test  $H_0 : p=0.05$  vs.  $H_a : p>0.05$ .
- **Question:** Is  $n$  large enough to justify finding  $P$ -value based on normal probabilities?
- **Response:**  
 $np_0 =$   
 $n(1-p_0) =$

***Looking Back:*** For confidence interval, checked 30 and 370 both at least 10.

## Example: Test with “>” Alternative (Review)

- **Note:** Step 1 requires 3 checks:
  - Is sample unbiased? (Sample proportion has mean 0.05?)
  - Is population  $\geq 10n$ ? (Formula for s.d. correct?)
  - Are  $np_0$  and  $n(1-p_0)$  both at least 10? (Find or estimate  $P$ -value based on normal probabilities?)
- 1. Students are “typical” humans; bias is issue at hand.
- 2. If  $p=0.05$ , sd of  $\hat{p}$  is  $\sqrt{\frac{0.05(1-0.05)}{400}}$  and
$$z = \frac{0.075 - 0.05}{\sqrt{\frac{0.05(1-0.05)}{400}}} = +2.29$$
- 3.  $P$ -value =  $P(Z \geq 2.29)$  is small: just over 0.01
- 4. Reject  $H_0$ , conclude  $H_a$ : picks were biased for #7.

## Example: Test with “Less Than” Alternative

- **Background:** 111/230 of surveyed commuters at a university walked to school.

Test and CI for One Proportion

Test of  $p = 0.5$  vs  $p < 0.5$

| Sample | X   | N   | Sample p | 95.0% Upper Bound | Z-Value | P-Value |
|--------|-----|-----|----------|-------------------|---------|---------|
| 1      | 111 | 230 | 0.482609 | 0.536805          | -0.53   | 0.299   |

- **Question:** Do fewer than half of the university's commuters walk to school?

- **Response:** First write  $H_0$ : \_\_\_\_\_ vs.  $H_a$ : \_\_\_\_\_

1. Students need to be rep. in terms of year.  $115 \geq 10$

2. Output  $\rightarrow \hat{p} =$  \_\_\_\_\_,  $z =$  \_\_\_\_\_. Large? \_\_\_\_\_

3.  $P$ -value = \_\_\_\_\_. Small? \_\_\_\_\_

4. Reject  $H_0$ ? \_\_\_\_\_ Conclude? \_\_\_\_\_

## Example: Test with “Not Equal” Alternative

□ **Background:** 43% of Florida’s community college students are disadvantaged.

□ **Question:** Is % disadvantaged at Florida Keys Community College (169/356=47.5%) unusual?

Test and CI for One Proportion

Test of  $p = 0.43$  vs  $p \text{ not } = 0.43$

| Sample | X   | N   | Sample p | 95.0% CI             | Z-Value | P-Value |
|--------|-----|-----|----------|----------------------|---------|---------|
| 1      | 169 | 356 | 0.474719 | (0.422847, 0.526592) | 1.70    | 0.088   |

□ **Response:** First write  $H_0$ : \_\_\_\_\_ vs.  $H_a$ : \_\_\_\_\_

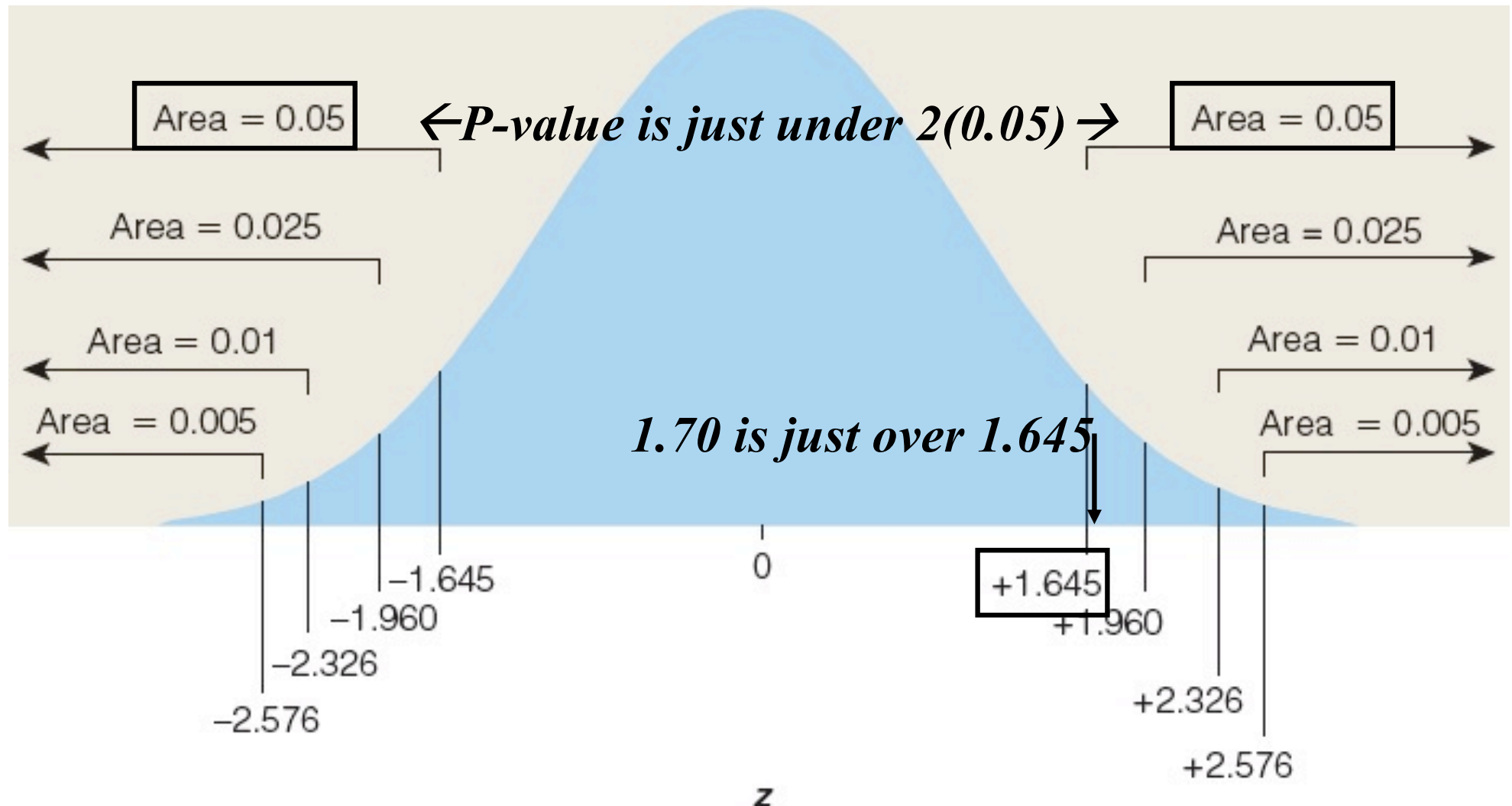
1. 356(0.43), 356(1-0.43) both  $\geq 10$ ; pop.  $\geq 10$ (356)

2.  $\hat{p}$  = \_\_\_\_\_,  $z$  = \_\_\_\_\_

3.  $P$ -value = \_\_\_\_\_; small? \_\_\_\_\_

4. Reject  $H_0$ ? \_\_\_\_\_ Is 47.5% unusual? \_\_\_\_\_

# 90-95-98-99 Rule to Estimate $P$ -value



# One-sided or Two-sided Alternative

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- Form of alternative hypothesis impacts  $P$ -value
- $P$ -value is *the* deciding factor in test
- Alternative should be based on what researchers hope/fear/suspect is true *before* “snooping” at the data
- If  $<$  or  $>$  is not obvious, use two-sided alternative (more conservative)

## Example: *How Form of Alternative Affects Test*

- **Background:** 43% of Florida's community college students are disadvantaged.
- **Question:** Is % disadvantaged at Florida Keys Community College (47.5%) unusually **high**?

Test of  $p = 0.43$  vs  $p > 0.43$

| Sample | X   | N   | Sample p | 95.0% Lower Bound | Z-Value | P-Value |
|--------|-----|-----|----------|-------------------|---------|---------|
| 1      | 169 | 356 | 0.474719 | 0.431186          | 1.70    | 0.044   |

- **Response:** Now write  $H_0: p = 0.43$  vs.  $H_a$ : \_\_\_\_\_
  1. Same checks of data production as before.
  2. Same  $\hat{p} = 0.475$  (*Note:  $0.475 > 0.43$* ), same  $z = +1.70$ .
  3. Now  $P$ -value = \_\_\_\_\_. Small? \_\_\_\_\_
  4. Is 47.5% significantly higher than 43%? \_\_\_\_\_



## $P$ -value for One- or Two-Sided Alternative

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- $P$ -value for one-sided alternative is **half**  $P$ -value for two-sided alternative.
- $P$ -value for two-sided alternative is **twice**  $P$ -value for one-sided alternative.

For this reason, two-sided alternative is more conservative (larger  $P$ -value, harder to reject  $H_0$ ).



# Thinking About Data

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Before getting caught up in details of test,  
consider evidence at hand.

## **Example:** *Thinking About Data at Hand*

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- **Background:** 43% of Florida's community college students are disadvantaged. At Florida Keys, the rate is 47.5%.
- **Question:** Is the rate at Florida Keys significantly lower?
- **Response:**

# Definition; How Small is a “Small” $P$ -value?

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**alpha ( $\alpha$ ):** cut-off level which signifies a  $P$ -value is small enough to reject  $H_0$

- Avoid blind adherence to cut-off  $\alpha = 0.05$
- Take into account...
  - **Past considerations:** is  $H_0$  “written in stone” or easily subject to debate?
  - **Future considerations:** What would be the consequences of either type of error?
    - Rejecting  $H_0$  even though it’s true
    - Failing to reject  $H_0$  even though it’s false

## Example: *Reviewing P-values and Conclusions*

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- **Background:** Consider our prototypical examples:
  - Are random number selections biased?  $P\text{-value}=0.011$
  - Do fewer than half of commuters walk?  $P\text{-value}=0.299$
  - Is % disadvantaged significantly different?  $P\text{-value}=0.088$
  - Is % disadvantaged significantly higher?  $P\text{-value}=0.044$
- **Question:** What did we conclude, based on  $P$ -values?
- **Response:** (Consistent with 0.05 as cut-off  $\alpha$  )
  - $P\text{-value}=0.011 \rightarrow$  Reject  $H_0$ ? \_\_\_\_\_
  - $P\text{-value}=0.299 \rightarrow$  Reject  $H_0$ ? \_\_\_\_\_
  - $P\text{-value}=0.088 \rightarrow$  Reject  $H_0$ ? \_\_\_\_\_
  - $P\text{-value}=0.044 \rightarrow$  Reject  $H_0$ ? \_\_\_\_\_

# Lecture Summary

## *(Inference for Proportions: Hypothesis Test)*

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- 4 steps in hypothesis test
  - Checking data production
  - Summarizing and standardizing
  - Finding a probability ( $P$ -value)
  - Conclusions as inference
- Posing null and alternative hypotheses
- Definitions and notation
- 3 forms of alternative hypothesis
- Assessing  $P$ -value
- Example with “greater than” alternative

# Lecture Summary

## *(More Hypothesis Tests for Proportions)*

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- Examples with 3 forms of alternative hypothesis
- Form of alternative hypothesis
  - Effect on test results
  - When data render formal test unnecessary
  - $P$ -value for 1-sided vs. 2-sided alternative
- Cut-off for “small”  $P$ -value