

# Lecture 27: Chapter 10, Sections 2-3

## Inference for Quantitative Variable

### Hypothesis Test with $t$

---

- Compare  $z$  and  $t$ ;  $t$  Test with Software
- How Large is “Large”  $t$ ?
- $t$  Test with Small  $n$
- What Leads to Rejecting  $H_0$ ; Errors, Multiple Tests
- Relating Confidence Interval and Test Results

# Looking Back: *Review*

---

## □ 4 Stages of Statistics

- Data Production (discussed in Lectures 1-4)
- Displaying and Summarizing (Lectures 5-12)
- Probability (discussed in Lectures 13-20)
- Statistical Inference
  - 1 categorical (discussed in Lectures 21-23)
  - 1 quantitative:  $z$  CI,  $z$  test,  $t$  CI,  $t$  test
  - categorical and quantitative
  - 2 categorical
  - 2 quantitative

## Standardizing Sample Mean to $t$ (*Review*)

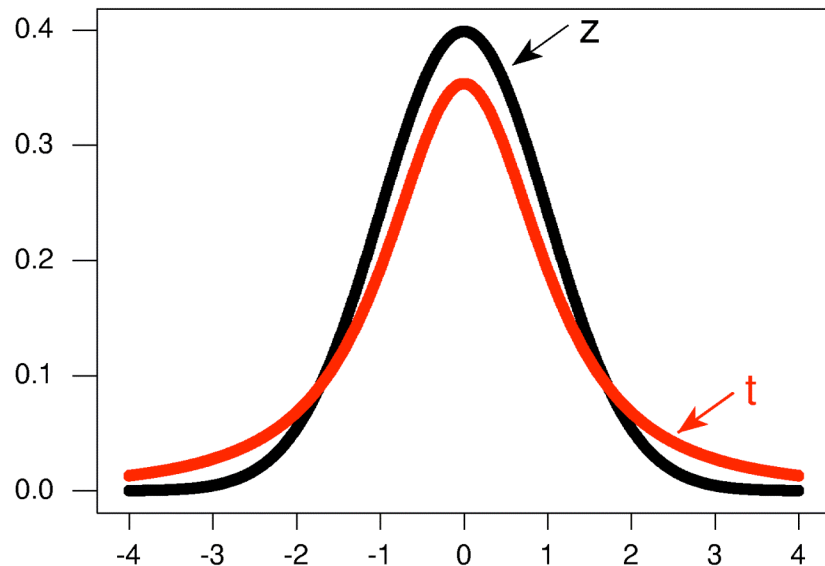
---

For random sample of size  $n$  from population with mean  $\mu$ , standard deviation  $\sigma$ , sample mean  $\bar{X}$  has

- mean  $\mu$
  - s.d.  $\frac{\sigma}{\sqrt{n}}$  (may have to substitute  $s$  for  $\sigma$ )
  - shape approximately normal for large enough  $n$
- For  $\sigma$  unknown and  $n$  small,  $\frac{\bar{x} - \mu}{s/\sqrt{n}} = t$
- $t$  (like  $z$ ) centered at 0, symmetric, bell-shaped
  - $t$  has  $n-1$  df (spread depends on  $n$ )

# Inference Based on $z$ or $t$ (Review)

By Hand	$\sigma$ known	$\sigma$ unknown
small sample ( $n < 30$ )	$\frac{\bar{x} - \mu}{\sigma / \sqrt{n}} = z$	$\frac{\bar{x} - \mu}{s / \sqrt{n}} = t$
large sample ( $n \geq 30$ )	$\frac{\bar{x} - \mu}{\sigma / \sqrt{n}} = z$	$\frac{\bar{x} - \mu}{s / \sqrt{n}} \approx z^*$



$z$  or  $t$  = standardized difference between sample mean and proposed population mean

*With software, simply use  $t$  if  $\sigma$  is unknown.*

*Distribution of  $t$  is “heavy tailed” for small  $n$ .*



## Comparing $z$ and $t$ Distributions

---

How different are the  $z$  and  $t$  distributions?

Unless  $n$  is very small, distributions are similar;  
cut-offs for various tail probabilities quite close.

Compared values of  $z$  and  $t$  ( $df=18$ ).

## Example: *t* Test (with Software)

- **Background:** Random sample of shoe sizes for 9 college males: 11.5, 12.0, 11.0, 15.0, 11.5, 10.0, 9.0, 10.0, 11.0
- **Question:** Can we believe mean shoe size of all college males is 11?
- **Response:** Use software: enter values, specify proposed mean 11 and “not-equal” alternative.

One-Sample T: Shoe

Test of  $\mu = 11$  vs  $\mu \text{ not } = 11$

Variable	N	Mean	StDev	SE Mean
Shoe	9	11.222	1.698	0.566
Variable	95.0% CI		T	P
Shoe	(	9.917, 12.527)	0.39	0.705

Note: small sample is OK because shoe sizes are normal.

Is *t* large? \_\_\_\_\_ Is *P*-value small? \_\_\_\_\_

Believe population mean=11? \_\_\_\_\_

# How Large is “Large” for $t$ Statistic

Excerpts from  $t$  table →

- May call values near **2** borderline for  $df > 10$
- May call values near **3** borderline for  $df < 5$

## Confidence Level

	90%	95%	98%	99%
<b><math>z</math> (infinite <math>n</math>)</b>	1.645	1.960 or 2	2.326	2.576
<b><math>t</math>: <math>df = 19</math> (<math>n = 20</math>)</b>	1.73	2.09	2.54	2.86
<b><math>t</math>: <math>df = 11</math> (<math>n = 12</math>)</b>	1.80	2.20	2.72	3.11
<b><math>t</math>: <math>df = 3</math> (<math>n = 4</math>)</b>	2.35	3.18	4.54	5.84



# Use of $t$ with Very Small Samples

---

Can assume shape of  $\bar{X}$  for random samples of **any** size  $n$  is approximately normal if graph of sample data appears **normal**.

Normal population  $\rightarrow \frac{\bar{x} - \mu}{s/\sqrt{n}}$  is exactly  $t$



## Example: *t* Test with Small *n*

- **Background:** Random sample of 4 Math SATs (570, 580, 640, 760) have mean 637.5, s.d. 87.3.
- **Question:** Do they represent population with mean greater than 500? (Use cut-off  $\alpha=0.05$ .)
- **Response:** *n* is small but *t* procedure is OK because SATs are normal:

One-Sample T: MathSAT

Test of  $\mu = 500$  vs  $\mu > 500$

Variable	N	Mean	StDev	SE Mean
MathSAT	4	637.5	87.3	43.7

Variable	95.0% Lower Bound	T	P
MathSAT	534.7	3.15	0.026

*P*-value = \_\_\_\_\_

Using cutoff 0.05, small enough to reject  $H_0$ ? \_\_\_\_\_

Conclude population mean  $> 500$ ? \_\_\_\_\_

## Example: *t* Test with Small *n*, 2-Sided Alternative

- **Background:** Random sample of 4 Math SATs (570, 580, 640, 760) have mean 637.5, s.d. 87.3.
- **Question:** Do they represent population with mean **different from** 500? (Use cut-off  $\alpha=0.05$ .)

- **Response:** Now use  $\neq$  alternative:

One-Sample T: MathSAT

Test of  $\mu = 500$  vs  $\mu \text{ not } = 500$

Variable	N	Mean	StDev	SE Mean
MathSAT	4	637.5	87.3	43.7
Variable	95.0% CI		T	P
MathSAT	(	498.6, 776.4)	3.15	0.051

*P*-value = \_\_\_\_\_

Using cutoff 0.05, small enough to reject  $H_0$ ? \_\_\_\_\_

Conclude population mean  $\neq$  500? \_\_\_\_\_

***A Closer Look:*** *t* near 3 can be considered borderline for very small *n*.



## One-sided vs. Two-sided Results

---

- Tested  $H_0 : \mu = 500$  vs.  $H_a : \mu > 500$   
 $P$ -value=0.026 → rejected  $H_0$
- Tested  $H_0 : \mu = 500$  vs.  $H_a : \mu \neq 500$   
 $P$ -value=0.051 → did not reject  $H_0$

*Suspecting mean > 500 got us significance*

## Example: *Concerns about 2-Sided Test*

---

- **Background:** Random sample of 4 Math SATs (570, 580, 640, 760) have mean 637.5, s.d. 87.3. The  $t$  test failed to reject  $H_0: \mu = 500$  vs. 2-sided  $H_a$  because  $P$ -value=0.051.
- **Question:** Should we believe 500 is a plausible value for the population mean?
- **Response:** Several concerns:
  - If these were students admitted to university, should have used “>” alternative.
  - $n=4$  very small  $\rightarrow$  vulnerable to Type \_\_\_\_ Error
  - MUST we stick to 0.05 as cut-off for small  $P$ -value? \_\_\_\_\_
  - Maybe could have found out  $\sigma$  and done \_\_\_\_ test instead.
  - Does  $\mu=500$  seem plausible when smallest value is 570? \_\_\_\_\_

## Factors That Lead to Rejecting $H_0$

---

**Statistically significant** data produce  $P$ -value small enough to reject  $H_0$ .  $t$  plays a role:

$$t = \frac{\bar{x} - \mu_0}{s/\sqrt{n}} = \frac{(\bar{x} - \mu_0)\sqrt{n}}{s}$$

Reject  $H_0$  if  $P$ -value small; if  $|t|$  large; if...

- Sample mean far from  $\mu_0$
- Sample size  $n$  large
- Standard deviation  $s$  small

## Factors That Lead to *Not* Rejecting $H_0$

---

$$t = \frac{\bar{x} - \mu_0}{s/\sqrt{n}} = \frac{(\bar{x} - \mu_0)\sqrt{n}}{s}$$

Can't reject  $H_0$  if  $P$ -value not small; if  $|t|$  not large; if...

- Sample mean close to  $\mu_0$
- Sample size  $n$  small
- Standard deviation  $s$  large



# Types I and II Error

---

- Small  $n$  can lead to Type II Error  
(Fail to reject false  $H_0$ ) (*Sampled only 4 SATs.*)
- Multiple tests can lead to Type I Error  
(Reject true  $H_0$ )...

## Example: *Multiple Tests*

---

- **Background:** Suppose all Verbal SATs have mean 500. Sample  $n=20$  scores each in 100 schools, each time test  $H_0 : \mu = 500$  vs.  $H_a : \mu < 500$ .
- **Question:** If we reject  $H_0$  in 4 of those schools, can we conclude that mean Verbal SAT in those 4 schools is significantly lower than 500?
- **Response:** If we set 0.05 as cut-off for small  $P$ -value then long-run probability of committing Type I Error (rejecting true  $H_0$ ) is \_\_\_\_.  
Even if all 100 schools actually have mean 500, by chance alone some samples will produce a sample mean low enough to reject  $H_0$  \_\_\_\_% of the time.





# Confidence Interval and Hypothesis Test Results

---

- Confidence Interval: range of plausible values
- Hypothesis Test: decides if a value is plausible

Informally,

- If  $\mu_0$  is **in** confidence interval, **don't reject**  $H_0 : \mu = \mu_0$
- If  $\mu_0$  is **outside** confidence interval, **reject**  $H_0 : \mu = \mu_0$

## Example: *Relating Confidence Interval to Test*

---

- **Background:** Consider these confidence intervals:
  - 95% CI for pop mean earnings (3171, 4381)
  - 95% CI for pop mean shoe size (9.9, 12.5)
  - 95% CI for pop mean Math SAT (498.6, 776.4)
- **Question:** What to conclude about hypotheses...?
  - $H_o : \mu = 5000$  vs.  $H_a : \mu < 5000$
  - $H_o : \mu = 11$  vs.  $H_a : \mu \neq 11$
  - $H_o : \mu = 500$  vs.  $H_a : \mu \neq 500$
- **Response:** Check if proposed mean is in interval:
  - Reject  $H_0$ ? \_\_\_\_\_
  - Reject  $H_0$ ? \_\_\_\_\_
  - Reject  $H_0$ ? \_\_\_\_\_

## Examples: *Reviewing z and t Tests (#1-#4)*

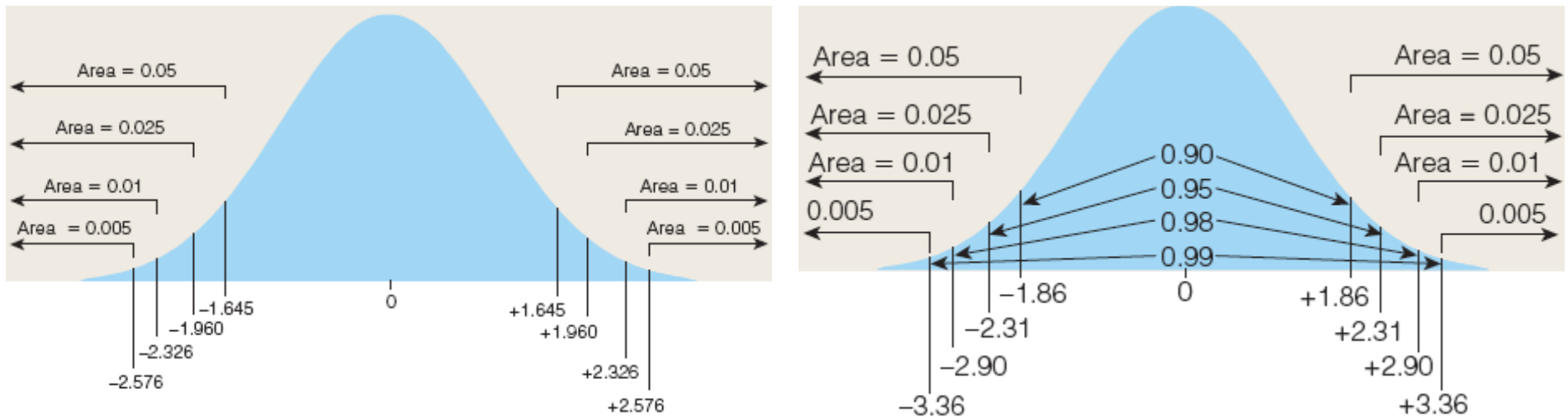
---

- **Background:** Sample mean and standard deviation of amount students spent on textbooks in a semester is being used to test if the mean for all students exceeds \$500. (The null hypothesis will be rejected if the  $P$ -value is less than 0.01.) We want to draw conclusions about mean credits taken by **all students at a particular college.**

***Looking Back:** If the sample is biased, or  $n$  is too small to guarantee  $\bar{X}$  to be approximately normal, neither  $z$  nor  $t$  is appropriate. Otherwise, use  $z$  if population standard deviation is known or  $n$  is large. Use  $t$  if population standard deviation is unknown and  $n$  is small.*

# Example: Reviewing $z$ and $t$ Tests (#1)

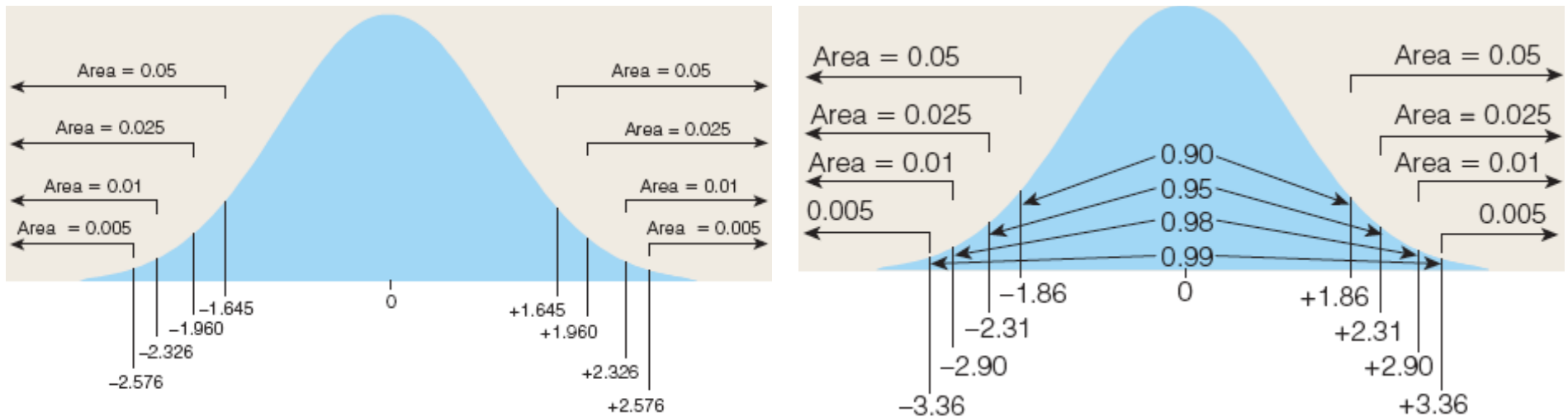
- **Background:** Sample mean and s.d. of textbook costs are used to test if  $\mu > 500$  (reject  $H_0$  if  $P$ -value  $< 0.01$ ). Refer to  $z$  (on left) or  $t$  for 8 df (on right) or **neither**.



- **Question:** What do we conclude if a **representative** sample of 9 students have  $t=+2.5$ ? There is an **outlier** in the data set.
- **Response:**

## Example: Reviewing $z$ and $t$ Tests (#2)

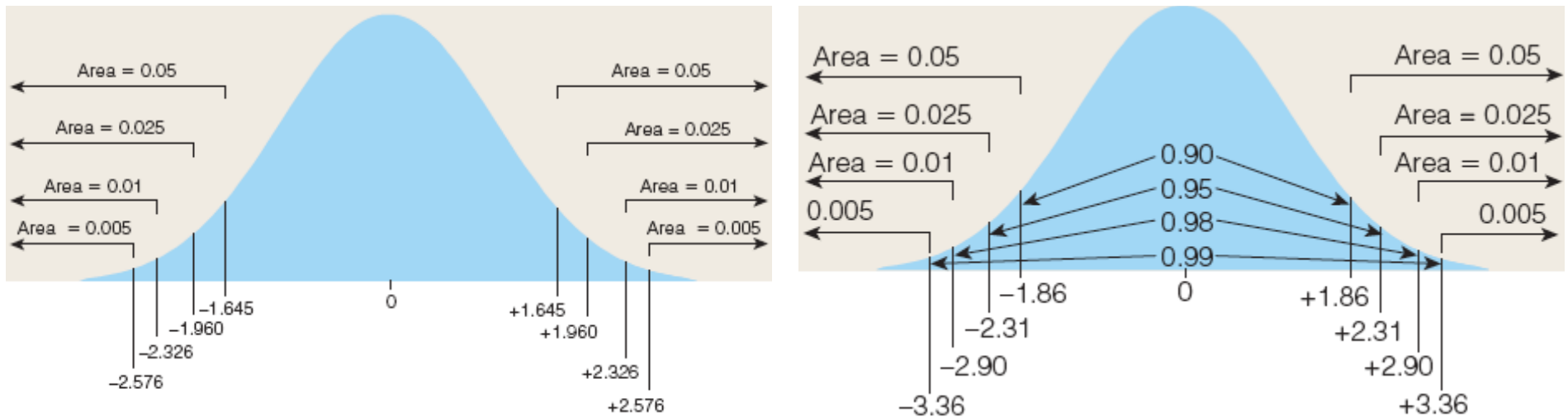
- **Background:** Sample mean and s.d. of textbook costs are used to test if  $\mu > 500$  (reject  $H_0$  if  $P$ -value  $< 0.01$ ). Refer to  $z$  (on left) or  $t$  for 8 df (on right) or **neither**.



- **Question:** What do we conclude if a **representative** sample of 9 students have  $t=+2.5$ ? The data set appears **normal**.
- **Response:** \_\_\_\_\_  $H_0$

## Example: Reviewing $z$ and $t$ Tests (#3)

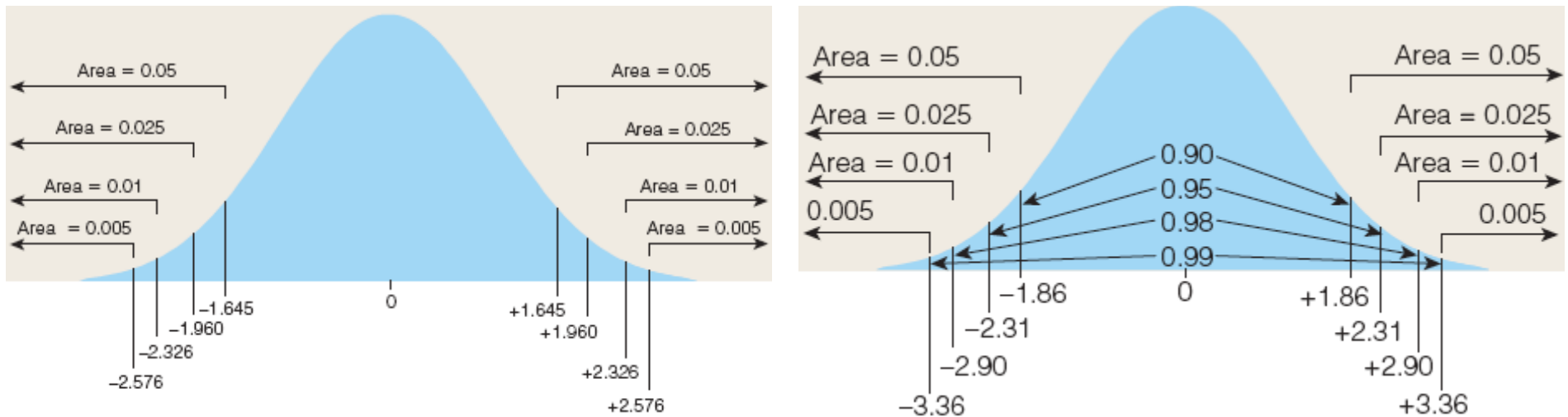
- **Background:** Sample mean and s.d. of textbook costs are used to test if  $\mu > 500$  (reject  $H_0$  if  $P$ -value  $< 0.01$ ). Refer to  $z$  (on left) or  $t$  for 8 df (on right) or **neither**.



- **Question:** What do we conclude if a **representative** sample of **90** students have  $t=+2.5$ ? There is an outlier in the data set.
- **Response:**

## Example: Reviewing $z$ and $t$ Tests (#4)

- **Background:** Sample mean and s.d. of textbook costs are used to test if  $\mu > 500$  (reject  $H_0$  if  $P$ -value  $< 0.01$ ). Refer to  $z$  (on left) or  $t$  for 8 df (on right) or **neither**.



- **Question:** What do we conclude if a sample of **90 biology majors** have  $t=+2.5$ ? The data set appears **normal**.
- **Response:**



# Lecture Summary

## *(Inference for Means: $t$ Hypothesis Test)*

---

- Comparing  $z$  and  $t$  distributions
- $t$  test with software
- How large is “large”  $t$ ?
- $t$  test with small  $n$  (one-sided or two-sided alternative)
- Factors that lead to rejecting null hypothesis
- Type I or II Error; multiple tests
- Relating confidence interval and test results
- Examples for review