

In Chapter 12:

- 12.1 Paired and Independent Samples
- 12.2 Exploratory and Descriptive Statistics
- 12.3 Inference About the Mean Difference
- 12.4 Equal Variance *t* Procedure (Optional)
- 12.5 Conditions for Inference
- 12.6 Sample Size and Power

Types of Samples when comparing means

- **Single sample.** One group; no concurrent control group
- **Paired samples.** Data points in samples uniquely matched
- **Two independent samples.** Separate groups (no matching or pairing)

```

graph TD
    A[Quantitative outcome] --> B[One sample §11.1 - §11.4]
    A --> C[Two samples]
    C --> D[Paired samples §11.5]
    C --> E[Independent samples Chapter 12]
    
```

Comparing Two Populations or Two Treatments

- “Comparative studies”
- One of the most common statistical situations
- Can arise
 - Experimentally (e.g., randomized trial)
 - Non-experimentally (various study designs)

“Two Groups” by Pieter Bruegel the Elder (c. 1525 – 1569)

Example: Cholesterol & Personality Type

Do cholesterol levels (mg/dl) differ by personality type?

Type A personality men ($n = 20$)
 233, 291, 312, 250, 246, 197, 268, 224, 239, 239, 254, 276, 234, 181, 248, 252, 202, 218, 212, 325

Type B personality men ($n = 20$)
 344, 185, 263, 246, 224, 212, 188, 250, 148, 169, 226, 175, 242, 252, 153, 183, 137, 202, 194, 213

* Data set WCGS.sav documented on p. 49 in the text.

Data Table

- One column for the response variable (chol)
- One column for the explanatory variable (group)

	chol	group	var	var
1	233	1		
2	291	1		
3	312	1		
4	250	1		
5	246	1		
6	197	1		
7	268	1		
8	224	1		
9	239	1		
10	239	1		
11	254	1		
12	276	1		
13	234	1		
14	181	1		
15	248	1		
16	252	1		
17	202	1		
18	218	1		
19	212	1		
20	325	1		

EDA

- Explore and compare the distributions before inferences
- EDA techniques
 - Side-by-side stemplots (right)
 - Side-by-side boxplots (next slide)

Group 1			Group 2

	1t		3
	1f		45
	1s		67
	98	1.	8889
	110	2*	011
	33332	2t	22
	55544	2f	4455
	76	2s	6
	9	2.	
	21	3*	
		3t	
		3f	4
		3s	
		(x100)	

8

© 2008 Jones and Bartlett Publishers

Nov-09

Side-by-Side Boxplots

- Location: group 1 > group 2
- Spreads: comparable
- Shapes: fairly symmetrical (although outside values are of some concern)

Nov-09

Notation

Parameters (population)

Group 1	N_1	μ_1	σ_1
Group 2	N_2	μ_2	σ_2

Statistics (sample)

Group 1	n_1	\bar{x}_1	s_1
Group 2	n_2	\bar{x}_2	s_2

$\bar{x}_1 - \bar{x}_2$ is the point estimator of $\mu_1 - \mu_2$

Nov-09

Example: Summary Statistics

Group	n	mean	std dev
1	20	245.05	36.64
2	20	210.30	48.34

Use computer or calculator to help calculate summary statistics

Nov-09

Standard Error of Mean Difference

How precisely does $\bar{x}_1 - \bar{x}_2$ estimate $\mu_1 - \mu_2$?

$$SE_{\bar{x}_1 - \bar{x}_2} = \sqrt{\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}}$$

For the data example:

$$SE_{\bar{x}_1 - \bar{x}_2} = \sqrt{\frac{36.638^2}{20} + \frac{48.340^2}{20}} = 13.563$$

Nov-09

Degrees of Freedom

Two ways to estimate **degrees of freedom**:

- df_{Welch} [formula on p. 244, but use computer]
- $df_{conserv.}$ = the smaller of $(n_1 - 1)$ or $(n_2 - 1)$

For the illustrative data:

$$df_{Welch} = 35.4 \text{ (via SPSS)}$$

$$df_{conserv.} = \text{smaller of } (n_1 - 1) \text{ or } (n_2 - 1) = 20 - 1 = 19$$

Nov-09

(1 - α)100% CI for μ₁-μ₂

$$(\bar{x}_1 - \bar{x}_2) \pm (t_{df, 1-\frac{\alpha}{2}})(SE_{\bar{x}_1 - \bar{x}_2})$$

Note consistency with other CI formulas:
 (point estimate) ± (z or t)(SE)

Also note:
 point estimate ± margin of error

Nov-09 14
© 2008 Jones and Bartlett Publishers

Comparison of CI Formulas (Point estimate) ± (t_{df, 1-α/2})(SE)

Type of sample	Point estimate	df for t*	SE
Single	\bar{x}	n - 1	$\frac{s}{\sqrt{n}}$
Paired	\bar{x}_d	n - 1	$\frac{s_d}{\sqrt{n}}$
Independent	$\bar{x}_1 - \bar{x}_2$	smaller of n ₁ -1 or n ₂ -1	$\sqrt{\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}}$

Nov-09 15
© 2008 Jones and Bartlett Publishers

Example

$\bar{x}_1 - \bar{x}_2 = 245.05 - 210.30 = 34.75$ For 95% confidence (α = .05)
 $SE_{\bar{x}_1 - \bar{x}_2} = 13.563$ (prior slide) use $t_{19, 1-\frac{\alpha}{2}} = t_{19, .975} = 2.093$
 $df_{conserv} = 20 - 1 = 19$ From Table C


95% CI for $\mu_1 - \mu_2 = (\bar{x}_1 - \bar{x}_2) \pm (t_{19, .975})(SE_{\bar{x}_1 - \bar{x}_2})$
 $= 34.75 \pm (2.093)(13.563)$
 $= 34.75 \pm 28.38$
 $= (6.4 \text{ to } 63.1) \text{ mg/dL}$

Likely mean difference in mean cholesterol, Type A and Type B populations

Nov-09 16
© 2008 Jones and Bartlett Publishers

Interpretive Notes

- The CI is aiming for μ₁ - μ₂ (NOT $\bar{x}_{11} - \bar{x}_{22}$)
- Recall the meaning of "confidence," i.e., based on a repeated sampling model
- Recall from prior chapters: the CI can be used to address a null hypotheses (covered next)



Nov-09 17
© 2008 Jones and Bartlett Publishers

Hypothesis Test

- Objective: To assess the "significance" of the observed difference between two sample means
- Note: widely different means can arise just by chance
- The null hypothesis starts with an assumption of no difference:
 $H_0: \mu_1 - \mu_2 = 0$; equivalently $H_0: \mu_1 = \mu_2$
- The alternative hypothesis can be
 $H_a: \mu_1 \neq \mu_2$ (two-sided) or
 $H_a: \mu_1 > \mu_2$ ("right-sided") or
 $H_a: \mu_1 < \mu_2$ ("left-sided")

Nov-09 18
© 2008 Jones and Bartlett Publishers

Two-Sample t Statistic

$$t_{stat} = \frac{(\bar{x}_1 - \bar{x}_2)}{SE_{\bar{x}_1 - \bar{x}_2}} \text{ where } SE_{\bar{x}_1 - \bar{x}_2} = \sqrt{\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}}$$

df_{Welch} or $df_{conserv}$ (see previous slide)

$$t_{stat} = \frac{(\bar{x}_1 - \bar{x}_2)}{SE_{\bar{x}_1 - \bar{x}_2}} = \frac{34.75}{13.563} = 2.56$$

$$df_{conserv} = 20 - 1 = 19$$

Note: Statisticians use two different two-sample t statistics. This one does *not* assume equal variance.

Nov-09 19
© 2008 Jones and Bartlett Publishers

P-value

- Use Table C or an Applet to determine the tail area beyond the observed $|t_{stat}|$ (one-tailed P -value).
- Double this for the two-tailed P
- Two-tailed P -value for t_{stat} of 2.56 with 19 df is .019

StaTable for Java (Version 1.0.2)

Distribution: Continuous Student's t

t: 2.56

df: 19.0

Left-tail: 0.990426

Two-tail: 0.019148

Nov-09 20
© 2008 Jones and Bartlett Publishers

SPSS Output

T-Test

Group Statistics				
GROUP	N	Mean	Std. Deviation	Std. Error Mean
Cholesterol (mg/dl) 1	20	245.00	38.928	8.793
2	20	210.30	48.340	10.809

	Levene's Test for Equality of Variances		t-Test for Equality of Means				95% Confidence Interval of the Difference		
	F	Sig.	t	df	Sig. (2-tailed)	Mean Difference	Std. Error Difference	Lower	Upper
Cholesterol (mg/dl)	Equal variances assumed	1.293	2.562	38	.014	34.70	13.563	7.293	62.10
	Equal variances not assumed		2.562	36.413	.015	34.70	13.589	7.227	62.17

Equal variance t procedure (\$12.4)

Equal Variance Not Assumed Preferred method (\$12.3)

Nov-09 21
© 2008 Jones and Bartlett Publishers

Interpretation

- Recall: smaller-and-smaller P -values provide stronger-and-stronger evidence against H_0 .
- Recall these conventions:
 - $.10 < P < 1.0$: evidence against H_0 is not significant
 - $.05 < P \leq .10$: evidence against H_0 is marginally signif.
 - $.01 < P \leq .05$: evidence against H_0 is significant
 - $P \leq .01$: evidence against H_0 is highly significant
- The current two-tailed P -value of .019 provides good evidence against H_0 ; the observed difference is thus significant.

Nov-09 22
© 2008 Jones and Bartlett Publishers

Summary of independent t test

A. $H_0: \mu_1 - \mu_2 = 0$ vs. $H_a: \mu_1 - \mu_2 \neq 0$

B. Test statistic

$$t_{stat} = \frac{(\bar{x}_1 - \bar{x}_2)}{SE_{\bar{x}_1 - \bar{x}_2}} \text{ where } SE_{\bar{x}_1 - \bar{x}_2} = \sqrt{\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}}$$

df_{Welch} or $df_{conserv}$

C. One-tailed $P = \Pr(T \geq |t_{stat}|)$
Two-tailed $P = 2 \times \text{one-tailed } P$

Nov-09 23
© 2008 Jones and Bartlett Publishers

Hypothesis Test with the CI

- $H_0: \mu_1 - \mu_2 = 0$ vs. $H_a: \mu_1 - \mu_2 \neq 0$
- Can be tested at the α -level of significance with the $(1 - \alpha)100\%$ CI
- For the illustrative example:
 - The 95% CI for $\mu_1 - \mu_2$ is (6.4 to 63.1). This excludes $\mu_1 - \mu_2 = 0$. Therefore, data are significant at $\alpha = .05$
 - The 99% CI for $\mu_1 - \mu_2$ is (-2.2 to 71.7). This includes $\mu_1 - \mu_2 = 0$. Therefore, data are not significant at $\alpha = .01$

Nov-09 24
© 2008 Jones and Bartlett Publishers

§12.5 Sample Size & Power

- Sample size and power for two-sample problems about mean can be address from these perspectives
- Sample size required for a CI to achieve margin of error m (pp. 250 - 1)
- d need to achieve a given margin of error
- Sample size to achieve given power (pp. 251 - 2)
- Minimal detectable difference (pp. 252 - 3)
- Power of a given test (pp. 252 - 3)

Nov-09 30
© 2008 Jones and Bartlett Publishers