

## Lecture 28: Chapter 11, Section 1 Categorical & Quantitative Variable Inference in Paired Design

- Inference for Relationships: 2 Approaches
- Cat→Quan Relationship: 3 Designs
- Inference for Paired Design
- Paired vs. Ordinary,  $t$  vs.  $z$

## 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 (discussed in Lectures 24-27)
    - cat and quan: **paired**, 2-sample, several-sample
    - 2 categorical
    - 2 quantitative

## Inference for Relationships: Two Approaches

- $H_0$  and  $H_a$  about **variables**: not related or related
  - Applies to all three C→Q, C→C, Q→Q
- $H_0$  and  $H_a$  about **parameters**: equality or not
  - C→Q: pop means equal? (mean diff=0? for paired)
  - C→C: pop proportions equal?
  - Q→Q: pop slope equals zero?

Either way, often do **test** before **confidence interval**.

1. Are **variables** related?
2. If so, quantify: how different are the **parameters**?

## Example: C→Q Test Relationship or Parameters

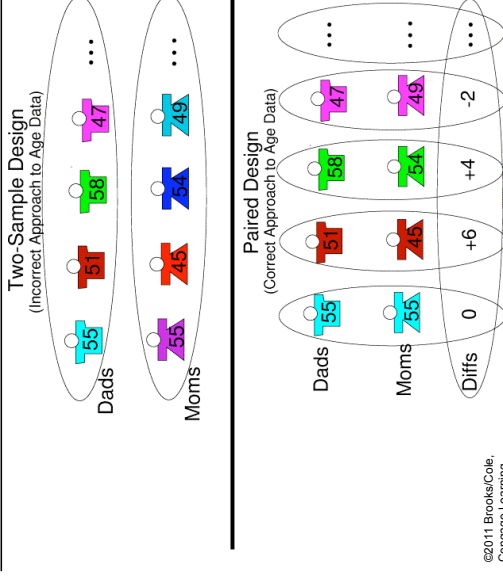
- **Background:** Research question: “For all students at a university, are their Math SATs related to what year they’re in?”
- **Question:** How can we formulate this in terms of parameters?
- **Response:**

**Looking Ahead:** This is a *several-sample design*, to be discussed after *paired and two-sample*.

## Inference Methods for Cat → Quan Relationship

- Paired: reduces to 1-sample  $t$  (already covered)
- Two-Sample: 2-sample  $t$  (similar to 1-sample  $t$ )
- Several-Sample: need new distribution ( $F$ )

## Paired Data: Incorrect vs. Correct Approach



## Example: Paired vs. Two-Sample Summary

- **Background:** Research Question: “Are ‘age of parent’ and ‘sex of parent’ related for population of students at a university?”
- **Question:** Which output has enough info to do inference?

Descriptive Statistics: DadAge, MomAge					
Variable	N	Mean	Median	TrMean	StDev
DadAge	431	50.831	50.000	50.491	6.167
MomAge	441	48.406	48.000	48.166	5.511

Descriptive Statistics: AgeDiff					
Variable	N	Mean	Median	TrMean	StDev
AgeDiff	431	2.448	2.000	2.171	3.877

- **Response:**

**Looking Ahead:** We will standardize with the StDev of the differences, which cannot be found from the individual StDevs because of dependence.

## Example: Consider Summaries in Paired Design

- **Background:** To see if ‘age of parent’ and ‘sex of parent’ are related for population of students at a university, took sampled DadAge minus MomAge.

Descriptive Statistics: AgeDiff					
Variable	N	Mean	Median	TrMean	StDev
AgeDiff	431	2.448	2.000	2.171	3.877

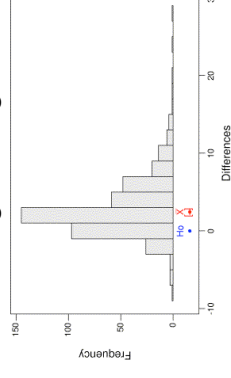
- **Question:** Which parent tended to be older in the sample?
- **Response:**

## Example: Display in Paired Design

- **Background:** To see if ‘age of parent’ and ‘sex of parent’ are related for population of students at a university, took sampled DadAge minus MomAge.
- **Question:** How do we display the data?
- **Response:**

## Example: Display in Paired Design

- **Background:** Histogram of age differences:



- **Question:** What does the histogram show?
- **Response:** Age differences have
  - Center: around \_\_\_\_\_ (dads tend to be about \_\_\_\_\_ yrs older)
  - Spread: most diffis within \_\_\_\_\_ yrs or mean)
  - Shape: \_\_\_\_\_ (a few dads much older than wife)

## Notation in Paired Study

- Differences have
  - Sample mean  $\bar{x}_d$
  - Population mean  $\mu_d$
  - Sample standard deviation  $S_d$
  - Population standard deviation  $\sigma_d$

## Test Statistic in Paired Study

- Start with ordinary 1-sample statistic  $t = \frac{\bar{x}_d - \mu_0}{s/\sqrt{n}}$
- Substitute  $\bar{x}_d$ ,  $s_d$  for ordinary summaries  $\bar{x}$ ,  $s$
- Substitute 0 for  $\mu_0$  ( $H_0$  will claim  $\mu_d = 0$ )
- Result is paired  $t$  statistic:  $t = \frac{\bar{x}_d - 0}{s_d/\sqrt{n}}$

## Example: Paired $t$ Test

- **Background:** Paired test on students' parents' ages:

Paired T for DadAge - MomAge		N	Mean	StDev	SE Mean
DadAge		431	50.831	6.167	0.297
MomAge		431	48.383	5.258	0.253
Difference		431	2.448	3.877	0.187

95% CI for mean difference: (2.081, 2.815)  
 T-Test of mean difference = 0 (vs not = 0): T-Value = 13.11 P-Value = 0.000

- **Question:** What does output tell about formal test?
- **Response:** Testing
  - Unbiased?  $n=431$  large?  $\text{Pop} \geq 10(431)$ ? \_\_\_\_\_
  - $\bar{x}_d =$  \_\_\_\_\_,  $t =$  \_\_\_\_\_ Large? \_\_\_\_\_
  - P-value = \_\_\_\_\_ Small? \_\_\_\_\_
  - Conclude pop mean diff = 0? \_\_\_\_\_ Sex and age related? \_\_\_\_\_

## Example: One- or Two-Sided $H_a$ in Paired Test

- **Background:** Paired test on students' parents' ages:

Paired T for DadAge - MomAge		N	Mean	StDev	SE Mean
DadAge		431	50.831	6.167	0.297
MomAge		431	48.383	5.258	0.253
Difference		431	2.448	3.877	0.187

95% CI for mean difference: (2.081, 2.815)  
 T-Test of mean difference = 0 (vs not = 0): T-Value = 13.11 P-Value = 0.000

- **Response:** Replace  $H_a : \mu_d \neq 0$  with \_\_\_\_\_
  - P-value would be \_\_\_\_\_
  - Conclude fathers in general are older? \_\_\_\_\_

## Example: Paired vs. Ordinary $t$ vs. $z$

- **Background:** Paired test on 431 students' parents' ages resulted in paired  $t$ -statistic +13.11.
  - **Question:** What does this tell us about the  $P$ -value?
  - **Response:**
    - Paired  $t$  same as ordinary  $t$  distribution
    - Ordinary  $t$  basically same as  $z$  for large  $n$
    - 13.11 sds above mean unusual? \_\_\_\_\_ →  $P$ -val = \_\_\_\_\_
    - Evidence that mean age diff is non-zero in pop.? \_\_\_\_\_
- Note:** for extreme  $t$  statistics, software not needed to estimate  $P$ -value.

## Confidence Interval in Paired Design

Confidence interval for  $\mu_d$  is

$$\bar{x}_d \pm \text{multiplier} \frac{s_d}{\sqrt{n}}$$

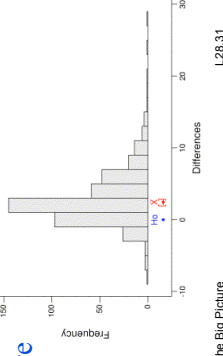
- Multiplier from  $t$  distribution with  $n-1$  df
  - Multiplier smaller for lower confidence
  - Multiplier smaller for larger df
- If  $n$  is small, diffs need to be approx. normal.  
 (Same guidelines as for 1-sample  $t$ )

## Guidelines: Sample Mean Diff Approx. Normal

- Can assume shape of  $\bar{X}_d$  for random samples of  $n$  pairs is approximately normal if
- Graph of sample **diffs** appears normal; or
  - Graph of sample **diffs** fairly symmetric and  $n$  at least 15; or
  - Graph of sample **diffs** moderately skewed and  $n$  at least 30; or
  - Graph of sample **diffs** very skewed and  $n$  much larger than 30

## Example: Paired Confidence Interval

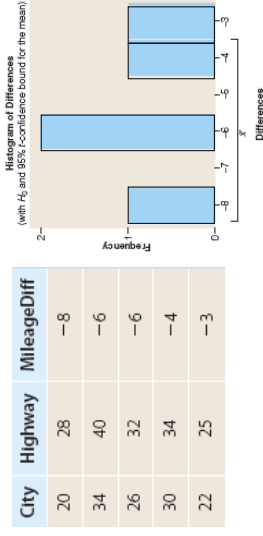
- **Background:** Sample of 431 students' parents' age differences have mean +2.45, s.d. 3.88.
- **Question:** What is a 95% confidence interval for population mean age difference?
- **Response:** Since  $n$  is so large,  $t$  multiplier \_\_\_\_\_ for 95% confidence. (Also, skewed hist. OK.)



Pretty sure population of fathers are older by about \_\_\_\_\_ to \_\_\_\_\_ years.

## Example: Checking Conditions for Paired $t$

- **Background:** Mileages for 5 cars, each tested in city and on highway (suspect higher on highway).



- **Question:** Is paired  $t$  procedure appropriate?
- **Response:** Histogram \_\_\_\_\_

## Example: Paired Test and Confidence Interval

- **Background:** Mileages for 5 cars, each tested in city and on highway (suspect higher on highway).

Paired  $t$  for City - Highway

	N	Mean	StDev	SE Mean
City	5	26.40	5.73	2.56
Highway	5	31.80	5.76	2.58
Difference	5	-5.400	1.949	0.872

95% upper bound for mean difference: -3.541

T-Test of mean difference = 0 (vs < 0): T-Value = -6.19 P-Value = 0.002

95% CI for mean difference: (-7.820, -2.980)

- **Question:** What does the output tell us?
- **Response:**
  - $P\text{-val}=0.002 \rightarrow$  \_\_\_\_\_
  - C.I.  $\rightarrow$  hwy av about \_\_\_\_\_ to \_\_\_\_\_ mpg better in pop of cars

### Example: Paired Confidence Interval by Hand

- **Background:** Mileage differences for 5 cars, city minus highway, had mean -5.40, s.d. 1.95.
- **Question:** What else is needed to set up a 95% confidence interval by hand for population mean difference?
- **Response:** Need \_\_\_\_\_ (obtained from table before software was available) Interval is \_\_\_\_\_

Note:  $n$  very small  $\rightarrow t$  multiplier closer to 3 than to 2.

### Example: Relating Test and Confidence Interval

- **Background:** Mileages for 5 cars, each tested in city and on highway (suspect higher on highway).

Paired T for City - Highway

	N	Mean	StDev	SE Mean
City	5	26.40	5.73	2.56
Highway	5	31.80	5.76	2.58
Difference	5	-5.400	1.949	0.872

95% upper bound for mean difference: -3.541

T-Test of mean difference = 0 (vs < 0): T-Value = -6.19 P-Value = 0.002

95% CI for mean difference: (-7.820, -2.980)

- **Question:** How is  $P$ -value consistent with C.I.?

- **Response:**

- Small  $P$ -value  $\rightarrow$  conclude  $H_a$ : pop mean of diffs \_\_\_\_\_
- Confidence interval shows only \_\_\_\_\_ numbers are plausible values for mean of diffs (entire C.I. \_\_\_\_\_)

### Example: Switching Columns in Paired Design

- **Background:** Mileages for 5 cars, each tested in city and on highway (suspect higher on highway).
- |            | N | Mean   | StDev | SE Mean |
|------------|---|--------|-------|---------|
| City       | 5 | 26.40  | 5.73  | 2.56    |
| Highway    | 5 | 31.80  | 5.76  | 2.58    |
| Difference | 5 | -5.400 | 1.949 | 0.872   |
- 95% upper bound for mean difference: -3.541  
T-Test of mean difference = 0 (vs < 0): T-Value = -6.19 P-Value = 0.002  
95% CI for mean difference: (-7.820, -2.980)
- **Question:** What would change if we took highway minus city?
  - **Response:** Since we suspect higher on highway,
    - Change to Highway-City and sign in  $H_a$  changes to \_\_\_\_\_
    - Sample mean of diffs would be \_\_\_\_\_ and  $t =$  \_\_\_\_\_
    - $P$ -value still 0.002, reject  $H_0 \rightarrow$  \_\_\_\_\_
    - Confidence interval would be \_\_\_\_\_

### Lecture Summary (Inference for Cat $\rightarrow$ Quan; Paired)

- Inference for relationships
  - Focus on variables
  - Focus on parameters
- cat  $\rightarrow$  quan relationship: paired, 2- or several-sample
- Inference for paired design
  - Output
  - Display
  - Notation
  - Test statistic
  - Form of alternative
- Paired  $t$  vs. ordinary  $t$  vs.  $z$
- Paired confidence interval vs. hypothesis test