

# **Lecture 5:**

# **Two-Factor Studies with One**

# **Case per Treatment**

**STA 106: Analysis of Variance**

# Two-Factor Studies with One Case per Treatment

Two-Way ANOVA Model without Interaction

Analysis of Variance

Test for Factor A and B Main Effects



Multiple Comparison Procedures

Tukey's test

Randomized Complete Block Designs

# Analysis of Factor A (and B ) Main Effects (When Factors Do Not Interact)

## Multiple Comparison Procedure: Bonferroni

Suppose we're interested in making inference about multiple quantities,  
that are linear combinations of factor A level means (or factor B level means),  
i.e., a family containing g linear combinations of factor level means

$$\mathcal{L} = \{L_1 = \sum_{i=1}^r c_{1i}\mu_i, \dots, L_g = \sum_{i=1}^r c_{gi}\mu_i\}$$

$$\hat{L} = \sum_i c_i \bar{Y}_{i.} \quad s^2(\hat{L}) = \frac{MSE}{b} \sum_i c_i^2$$

Bonferroni's idea:

One very easy and conservative way to control family-wise error rate at  $\alpha$  is to control individual test's significance level at  $\alpha_0 = \frac{\alpha}{g}$

This procedure includes any inference about a single quantity as special case, just take  $g=1$ .

# Analysis of Factor A (and B ) Main Effects (When Factors Do Not Interact)

## Multiple Comparison Procedure: Bonferroni

$(1 - \alpha)100\%$  confidence interval for individual quantity in this family:

$$\hat{L}_i \pm Bs \left( \hat{L}_i \right) \text{ for } i = 1 \dots g$$

$$B = t \left( 1 - \frac{\alpha}{2g}; (a-1)(b-1) \right)$$

Guarantee:

family-wise confidence coefficient is at least  $(1 - \alpha)100\%$

Meaning:

in at least  $(1 - \alpha)100\%$  of repetition of experiments, all the intervals in the family cover the true corresponding  $L_i$ 's  $\alpha\%$  of repetition of experiments, some tests in the family made false discovery when the null hypothesis was true.

Hypothesis testing (t-test) for individual quantity in this family:

$$H_0^i : L_i = 0 \quad H_a^i : L_i \neq 0$$

$$t^* = \frac{\hat{L}_i}{s(\hat{L}_i)} \sim t_{n_T - r} \text{ if } H_0 \text{ is true}$$

If  $|t^*| \leq B$ , conclude  $H_0$

If  $|t^*| > B$ , conclude  $H_a$

Guarantee:

family-wise Type I error is at most  $\alpha$

Meaning:

in at most  $\alpha\%$  of repetition of experiments, some tests in the family made false discovery when the null hypothesis was true.

# Analysis of Factor A (and B ) Main Effects (When Factors Do Not Interact)

## Multiple Comparison Procedure: Sheffe

Suppose we're interested in making inference about all possible contrasts of factor A level means  
i.e., a family containing all possible contrasts of factor A level means

$$\mathcal{L} = \{L = \sum_{i=1}^r c_i \mu_i, \text{ where } \sum_{i=1}^r c_i = 0\}$$

Infinitely many claims or quantities

$$\hat{L} = \sum_i c_i \bar{Y}_{i..} \quad s^2(\hat{L}) = \frac{MSE}{b} \sum_i c_i^2$$

# Analysis of Factor A (and B ) Main Effects (When Factors Do Not Interact)

## Multiple Comparison Procedure: Sheffe

$(1 - \alpha)100\%$  confidence interval for individual quantity in this family:

$$\hat{L}_i \pm Ss(\hat{L}_i)$$

$$S = \sqrt{(a-1)F(1-\alpha; a-1, (a-1)(b-1))}$$

Guarantee:

family-wise confidence coefficient is at least  $(1 - \alpha)100\%$

Meaning:

in at least  $(1 - \alpha)100\%$  of repetition of experiments, all the intervals in the family cover the true corresponding  $L_i$ 's  $\alpha\%$  of repetition of experiments, some tests in the family made false discovery when the null hypothesis was true.

Hypothesis testing (t-test) for individual quantity in this family:

$$H_0^i : L_i = 0 \quad H_a^i : L_i \neq 0$$

$$t^* = \frac{\hat{L}_i}{s(\hat{L}_i)}$$

If  $|t^*| \leq S$ , conclude  $H_0$

If  $|t^*| > S$ , conclude  $H_a$

Guarantee:

family-wise Type I error is at most  $\alpha$

Meaning:

in at most  $\alpha\%$  of repetition of experiments, some tests in the family made false discovery when the null hypothesis was true.

# Analysis of Factor A (and B ) Main Effects (When Factors Do Not Interact)

## Multiple Comparison Procedure: Tukey

Suppose we're interested in making inference about all pairwise comparisons of factor level means  
i.e., a family containing all pairwise comparisons of factor level means

$$\mathcal{L} = \{D_{ii'} = \mu_i - \mu_{i'} \text{ for } i \neq i'\}$$

$$\frac{a(a-1)}{2} \quad \text{Pairwise comparisons}$$

$$\hat{D}_{ii'} = \bar{Y}_{i..} - \bar{Y}_{i'..} \quad s^2(\hat{D}_{ii'}) = MSE \frac{2}{b}$$

# Analysis of Factor A (and B ) Main Effects (When Factors Do Not Interact)

## Multiple Comparison Procedure: Tukey

$(1 - \alpha)100$  % confidence interval for individual quantity in this family:

$$\hat{D}_{ii'} \pm Ts \left( \hat{D}_{ii'} \right)$$

$$T = \frac{1}{\sqrt{2}} q(1 - \alpha; a, (a - 1)(b - 1))$$

Guarantee:

family-wise confidence coefficient is at least  $(1 - \alpha)100$  %

Meaning:

in at least  $(1 - \alpha)100$  % of repetition of experiments, all the intervals in the family cover the true corresponding  $L_i$ 's  $\alpha$  % of repetition of experiments, some tests in the family made false discovery when the null hypothesis was true.

Hypothesis testing (t-test) for individual quantity in this family:

$$H_0^i : D_{ii'} = 0 \quad H_a^i : D_{ii'} \neq 0$$

$$q^* = \frac{\hat{D}_{ii'}}{s(\hat{D}_{ii'})}$$

If  $|q^*| \leq T$ , conclude  $H_0$

If  $|q^*| > T$ , conclude  $H_a$

Guarantee:

family-wise Type I error is at most  $\alpha$

Meaning:

in at most  $\alpha$  % of repetition of experiments, some tests in the family made false discovery when the null hypothesis was true.



# Example

Make all pairwise comparisons for different sizes of city and regions; use the Bonferroni procedure with a 90 percent family confidence coefficient. State your findings.

There are 3 pairwise comparison for factor A and 1 pairwise comparisons for factor B, 4 in total.

$$B = t(1 - \alpha/8, (a - 1)(b - 1))$$

```
## [1] 6.205347
```

For factor A,  $\hat{D}_{12} = \bar{Y}_{1.} - \bar{Y}_{2.}$

$$\bar{Y}_{1.} - \bar{Y}_{2.} \pm B \sqrt{\frac{2MSE}{b}}$$

Code

```
## [1] -76.97457 313.02543
```

$\hat{D}_{13} = \bar{Y}_{1.} - \bar{Y}_{3.}$

$$\bar{Y}_{1.} - \bar{Y}_{3.} \pm B \sqrt{\frac{2MSE}{a}}$$

Code

```
## [1] -91.97457 328.02543
```

$\hat{D}_{23} = \bar{Y}_{2.} - \bar{Y}_{3.}$

$$\bar{Y}_{2.} - \bar{Y}_{3.} \pm B \sqrt{\frac{2MSE}{b}}$$

Code

```
## [1] -16.97457 403.02543
```

For factor B,  $\hat{D}_{12} = \bar{Y}_{.1} - \bar{Y}_{.2}$

$$\bar{Y}_{.1} - \bar{Y}_{.2} \pm B \sqrt{\frac{2MSE}{a}}$$

Code

```
## [1] 28.38777 348.38777
```

For this family of confidence intervals, the following conclusions may be drawn with family confidence coefficient of 90 percent:

- The average premium for different city sizes do not differ
- But the average premium for Eastern cities is higher than Western cities.