

## The Multiple Comparisons

There are many methods for multiple-comparisons. Most are for pairwise comparisons of group means, to determine which are significantly different from which others. Other methods, though, are for more specialized purposes (*e.g. comparing each of several treatments to a control*) or allow testing of more - general hypotheses contrasting sets of group means (*as is often done in preplanned “contrasts”*).

The various methods differ in how well they properly control the overall significance level and in their relative power; some, such as the popular “*Duncan’s multiple range test*” do not control the overall significance level. The ones described in this handout all adequately control overall significance and are either easy to use or powerful. They are:.

- **Bonferroni** : extremely general and simple, but often not powerful.
- **Tukey’s** :the best for all-possible pairwise comparisons when sample sizes are unequal or confidence intervals are needed; very good even with equal samples sizes without confidence intervals.
- **Stepdown**: the most powerful for all possible pairwise comparisons when sample sizes are equal.
- **Dunnett’s** :for comparing one sample (“*control*”) to each of the others, but not comparing the others to each other.

- **MCB** : compares each mean to the “best” (largest or smallest, as you specify) of the other means.
- **Scheffé’s** :for unplanned contrasts among sets of means.
- **Fisher’s ( LSD )**:Is a method for comparing treatment group means after the ANOVA null hypothesis of equal means has been rejected using the ANOVA F-test. If the F-test fails to reject the null hypothesis this procedure should not be used.

## Least Significant Differences (LSD)

To find the LSD value .:

- ❖ Calculate **MSE** or read from ANOVA table. *Note:*  $MSE = S_p^2$
- ❖ Calculate **SED** " *standard error deviation*".

$$SED = \sqrt{\frac{2MSE}{r}} \quad \text{or} \quad \sqrt{MSE \times \frac{1}{n_1} + \frac{1}{n_2}}$$

- Use  $r$  ,the number of replications, if the required SED is between all the means of a given experiment. In addition to the observation number of all sample is equal.
- Use  $[\frac{1}{n_1} + \frac{1}{n_2}]$  for SED is between two specified means, and  $n_1 \neq n_2$  . In other word, the observation number of samples is different.
- ❖ Find the table  $t$  , using  $df_{\text{error}}$  with required level of significance ( two – tailed ).
- ❖ Calculate **LSD =  $t_{\text{table}} \times SED$** .

- ❖ Compare this **LSD** with the differences between the pairs of means and make a decision as to which pairs are significantly different.

**Example .:**

Let s assume we have 4 treatment groups A, B, C and D. the summary statistics for groups are .:

Group	$\bar{y}$	S	n
A	74.3	5.6	10
B	82.8	5.1	10
C	77.8	5.3	10
D	82.9	4.6	10

The ANOVA table for this data is .:

S.O.V.	df	SS	MS	F <sub>statistics</sub>	F <sub>table 0.05</sub>
Between samples	3	523.7	174.57	6.55	2.888
Within samples	36	959.58	26.65		
Total	39	1483.28			

Since the  $F_{\text{table}}$  less than  $F_{\text{statistics}}$  at 0.05 level, we reject the null hypothesis  $H_0 : \mu_A = \mu_B = \mu_C = \mu_D$ .

At this point we are interested in doing pairwise comparisons of the means. That is , we want to test hypotheses of the sort  $H_0 : \mu_A = \mu_B$  ,  $H_0 : \mu_A = \mu_C$  , etc. The LSD method for testing the hypothesis  $H_0$  proceeds as follows .:

$$\text{LSD} = t_{(0.05/2), \text{df error}} \sqrt{\frac{2\text{MSE}}{r}}$$

$$t_{(0.025), 39} = 2.0231$$

$$\text{SED} = \sqrt{\frac{2 \times 26.65}{10}}$$

$$\begin{aligned} \text{LSD} &= 2.0231 \sqrt{\frac{2 \times 26.65}{10}} \\ &= 4.67 \end{aligned}$$

If  $|A - B| \geq \text{LSD}$  then we reject the null hypothesis. For our example  $|A - B| = 8.5$  which is greater than 4.67 so we reject  $H_0$  at the 0.05 level.

We then continue to test all pairs of interest. In this case the LSD is the same for all pairs because  $n_A = n_B = n_C = n_D$ . Thus  $\text{LSD}_{A,B} = \text{LSD}_{A,C} = \dots = \text{LSD}_{C,D} = 4.67$  and we compare all pairwise differences in the means to 4.67. Here are the absolute pairwise differences and the results of Fisher's LSD :

$$|A - B| = 8.5 \geq 4.67 \quad \text{reject } H_0 : \mu_A = \mu_B.$$

$$|A - C| = 3.5 < 4.67 \quad \text{do not reject } H_0 : \mu_A = \mu_C.$$

$$|A - D| = 8.6 \geq 4.67 \quad \text{reject } H_0 : \mu_A = \mu_D.$$

$$|B - C| = 5.0 \geq 4.67 \quad \text{reject } H_0 : \mu_B = \mu_C.$$

$$|B - D| = 0.1 < 4.67 \quad \text{do not reject } H_0 : \mu_B = \mu_D.$$

$$|C - D| = 5.1 \geq 4.67 \quad \text{reject } H_0 : \mu_C = \mu_D.$$

### **Example :**

A trial with 5 treatments was replicated 4 times. Given the following data, find the pairs of means with significant differences. Tested at 0.05 level.

Treatment ∴	A	B	C	D	E
Mean ∴	8.0	6.5	3.0	4.0	5.4
MSE = 4.53	and $df_{\text{error}} = 15$				

### Calculations ∴

$$* \text{ SED} = \sqrt{\frac{2MSE}{r}} = \sqrt{\frac{2 \times 4.53}{4}}$$

$$* t_{(0.05/2), 15} = 2.131 \quad \text{at } 0.05 \text{ level.}$$

$$* t_{(0.01/2), 15} = 2.947 \quad \text{at } 0.01 \text{ level.}$$

$$\begin{aligned}
 * \text{ LSD}_{\text{at } 0.05} &= t_{(0.05/2), 15} \sqrt{\frac{2MSE}{r}} \\
 &= 2.131 \sqrt{\frac{2 \times 4.53}{4}} \\
 &= 3.21
 \end{aligned}$$

### The difference between means

$$A - B = 1.5 < 3.21 \quad \text{No significantly different.}$$

$$A - C = 5 \geq 3.21 \quad \text{Significantly different.}$$

$$A - D = 4 \geq 3.21 \quad \text{Significantly different.}$$

$$A - E = 2.6 < 3.21 \quad \text{No significantly different.}$$

$$B - C = 3.5 \geq 3.21 \quad \text{Significantly different.}$$

$$B - D = 2.5 < 3.21 \quad \text{No significantly different.}$$

$$B - E = 1.1 < 3.21 \quad \text{No significantly different.}$$

$$C - D = 1.0 < 3.21 \quad \text{No significantly different.}$$

$$C - E = 2.4 < 3.21 \quad \text{No significantly different.}$$

$$D - E = 1.4 < 3.21 \quad \text{No significantly different.}$$

That is , at the 0.05 level , mean of A is significantly different to C and D ; mean of B is significantly different to C; no other means are significantly different.

$$\begin{aligned} \text{LSD}_{0.01} &= t_{(0.01/2), 15} \sqrt{\frac{2MSE}{r}} \\ &= 2.947 \sqrt{\frac{2 \times 4.53}{4}} = 4.435 \end{aligned}$$

The different between means

A – B = 1.5 < 4.435 No significantly different.

A – C = 5 ≥ 4.435 Significantly different.

A – D = 4 < 4.435 No significantly different.

A – E = 2.6 < 4.435 No significantly different.

B – C = 3.5 < 4.435 No significantly different.

B – D = 2.5 < 4.435 No significantly different.

B – E = 1.1 < 4.435 No significantly different.

C – D = 1.0 < 4.435 No significantly different.

C – E = 2.4 < 4.435 No significantly different.

D – E = 1.4 < 4.435 No significantly different.

At the 0.01 level , mean of A is significantly different to C ; no other means are significantly different.

**Example** ∴ ( ANOVA two – way )

In the example of air pollution in five different sites from Karbala city. The ANOVA table for this example is ∴.

S.O.V.	df	SS	MS	F <sub>statistics</sub>	F <sub>table 0.01</sub>
<b>A<sub>(time)</sub></b>	3	1182.95	394.32	F <sub>A</sub> =10.72	3.49
<b>B<sub>(location)</sub></b>	4	1947.50	486.875	F <sub>B</sub> =13.24	3.26
<b>Error</b>	12	441.30	36.775		
<b>Total</b>	19	3571.75			

The summary statistics for groups are .:

<b>Group A (Months)</b>	$\bar{X}$	<b>n</b>
<b>Oct.</b>	66.2	5
<b>Jan.</b>	75.2	5
<b>May.</b>	58	5
<b>Sept.</b>	55.6	5

<b>Group B (Location)</b>	$\bar{Y}$	<b>n</b>
<b>Location 1</b>	72.25	4
<b>Location 2</b>	62.75	4
<b>Location 3</b>	77	4
<b>Location 4</b>	56.75	4
<b>Location 5</b>	50	4

Tested that at  $\alpha : 0.01$

**Answer .:**

From above data

$$MSE = 36.775$$

$$n_A = 5$$

$$n_B = 4$$

$$df_{\text{error}} = 12$$

$$SED_A = \sqrt{\frac{2MSE}{n}}$$

$$= \sqrt{\frac{2 \times 36.775}{5}}$$

$$t_{(0.01/2), 12} = 3.055$$

$$LSD_A = t_{(0.01/2), 12} \sqrt{\frac{2MSE}{n}}$$

$$= 3.055 \sqrt{\frac{2 \times 36.775}{5}}$$

$$= 11.717$$

The difference between A means (the months).

$ Oct. - Jan.   = 9 < 11.717$	No significantly difference
$ Oct. - May.   = 8.2 < 11.717$	No significantly difference
$ Oct. - Sept.   = 10.6 < 11.717$	No significantly difference
$ Jan. - May.   = 17.2 \geq 11.717$	Significantly difference
$ Jan. - Sept.   = 19.6 \geq 11.717$	Significantly difference
$ May. - Sept.   = 2.4 < 11.717$	No significantly difference

That is , at the 0.01 level , means of months are significantly difference only between Jan. to May. , and Jan. to Sept. No other means are significantly difference.

$$SED_B = \sqrt{\frac{2MSE}{n}}$$

$$= \sqrt{\frac{2 \times 36.775}{4}}$$

$$LSD_B = t_{(0.01/2), 12} \sqrt{\frac{2MSE}{n}}$$



$$= 3.055 \sqrt{\frac{2 \times 36.775}{4}}$$
$$= 13.1$$

The difference between B means ( the locations).

$ 1 - 2  = 9.5 < 13.1$	No significantly difference
$ 1 - 3  = 4.5 < 13.1$	No significantly difference
$ 1 - 4  = 15.5 \geq 13.1$	Significantly difference
$ 1 - 5  = 22.25 \geq 13.1$	Significantly difference
$ 2 - 3  = 14.25 \geq 13.1$	Significantly difference
$ 2 - 4  = 6 < 13.1$	No significantly difference
$ 2 - 5  = 12.75 < 13.1$	No significantly difference
$ 3 - 4  = 20.25 \geq 13.1$	No significantly difference
$ 3 - 5  = 27 \geq 13.1$	No significantly difference
$ 4 - 5  = 6.75 < 13.1$	No significantly difference