

Chapter four The experimental design

4) One way & repeated measures.

4.1) model:

$$X_{ij} = \mu + \alpha_i + \beta_j + \varepsilon_{ij}, i = 1, 2, \dots, A, j = 1, 2, \dots, B,$$

$$\varepsilon_{ij} \stackrel{iid}{\sim} N(0, \sigma^2), \sum_{i=1}^A \alpha_i = 0, E(\beta_j) = 0, \text{Var}(\beta_j) = \sigma_\beta^2,$$

Note : The error distribution is normal distribution only.

4.2) The analysis:

$$X_{ij} = \hat{\mu} + \hat{\alpha}_i + \hat{\beta}_j + e_{ij},$$

$$\Rightarrow \sum_i \sum_j X_{ij} = \sum_i \sum_j \hat{\mu} + \sum_i \sum_j \hat{\alpha}_i + \sum_i \sum_j \hat{\beta}_j + \sum_i \sum_j e_{ij},$$

$$\text{when } \sum_j e_{ij} = 0, \sum_j \hat{\beta}_j = 0, \hat{\mu} + \hat{\alpha}_i = \frac{\sum_j X_{ij}}{B} = \bar{X}_{i\bullet},$$

$$\text{when } \sum_i e_{ij} = 0, \sum_i \hat{\alpha}_i = 0, \hat{\mu} + \hat{\beta}_j = \frac{\sum_i X_{ij}}{A} = \bar{X}_{\bullet j},$$

$$\Rightarrow \sum_i \sum_j X_{ij} = \sum_i \sum_j \hat{\mu} + B \times \sum_i \hat{\alpha}_i + A \times \sum_j \hat{\beta}_j,$$

$$\text{when } \sum_i \hat{\alpha}_i = 0, \sum_j \hat{\beta}_j = 0,$$

$$\Rightarrow \sum_i \sum_j X_{ij} = n_T \times \hat{\mu}, \hat{\mu} = \frac{\sum_i \sum_j X_{ij}}{n_T} = \bar{X}_{\bullet\bullet}, n_T = A \times B,$$

$$\hat{\alpha}_i = \bar{X}_{i\bullet} - \bar{X}_{\bullet\bullet},$$

$$\hat{\beta}_j = \bar{X}_{\bullet j} - \bar{X}_{\bullet\bullet},$$

$$e_{ij} = X_{ij} - \bar{X}_{i\bullet} - \bar{X}_{\bullet j} + \bar{X}_{\bullet\bullet},$$

$$X_{ij} = \hat{\mu} + \hat{\alpha}_i + \hat{\beta}_j + e_{ij} \Rightarrow X_{ij} - \bar{X}_{\bullet\bullet} = (\bar{X}_{i\bullet} - \bar{X}_{\bullet\bullet}) + (\bar{X}_{\bullet j} - \bar{X}_{\bullet\bullet}) + e_{ij},$$

$$\sum_i \sum_j (X_{ij} - \bar{X}_{\bullet\bullet}) X_{ij} = \sum_i \sum_j \hat{\alpha}_i \times X_{ij} + \sum_i \sum_j \hat{\beta}_j \times X_{ij} + \sum_i \sum_j e_{ij} \times X_{ij},$$

$$SST = \sum_i \sum_j (X_{ij})^2 - n_T \times (\bar{X}_{\bullet\bullet})^2, df = n_T - 1,$$

$$SSE = \sum_i \sum_j e_{ij} \times (\hat{\mu} + \hat{\alpha}_i + \hat{\beta}_j + e_{ij}) = \sum_i \sum_j (e_{ij})^2, df = (A-1) \times (B-1),$$

$$SSA = \sum_i \sum_j \hat{\alpha}_i \times X_{ij} = \sum_i \sum_j \hat{\alpha}_i \times (\hat{\mu} + \hat{\alpha}_i + \hat{\beta}_j + e_{ij}) = \sum_i \sum_j (\hat{\alpha}_i)^2$$

$$= \sum_i \sum_j (\bar{X}_{i\bullet} - \bar{X}_{\bullet\bullet})^2, df = A - 1,$$

ANOVA

Soruce	df	SS	MS
Subject	$B - 1$	SSB	
Between	$A - 1$	SSA	$MSA = SSA / (A - 1)$
Error	$(A - 1)(B - 1)$	SSE	$MSE = SSE / ((A - 1)(B - 1))$
Total	$A \times B - 1$	SST	

$H_0 : \alpha_1 = \dots = \alpha_A = 0, H_1 : \text{against } H_0$

$$\text{test statistic} = \frac{SSA / (A - 1)}{SSE / ((A - 1) \times (B - 1))}$$

4.3) Three basic assumption test:

4.3.1) The error probability distribution: Pearson chi square test.

When the sample size less than 8, this test will be not done.

4.3.2) The homogenous of variances:

$H_0 : \sigma_{11}^2 = \dots = \sigma_{AB}^2, H_1 : \text{against } H_0$

The test statistic is $\frac{\text{Max}(e_{11}^2, \dots, e_{AB}^2)}{SSE}$ (The critical value is gotten by simulation)

4.3.3) Whether error is randomly or not:

$H_0 : \text{Error is random } H_1 : \text{against } H_0$

The run test.

4.4) The multiple comparison:

$(1 - \alpha) \times 100\%$ C.I. for $\mu_{i\cdot} - \mu_{j\cdot} (i \neq j, i = 1, 2, \dots, A, j = 1, 2, \dots, A)$

$$(\bar{Y}_{i\cdot} - \bar{Y}_{j\cdot}) \pm \text{critical value} \times \sqrt{MSE} \times \sqrt{\frac{1}{B} + \frac{1}{B}}$$

Error is normal is LSD, it is $t_{\alpha/2, (A-1)(B-1)}$,

Error is non-normal : The critical value is gotten by simulation.

4.5)

? [The is probability and statistics software]
The sample data has two methods
===== choose one=====

1. Sample data come from input data file
2. Sample data come from the simulating mehtod and the probability distribution simulating.
3. Simulating experimental deisgn sample data
4. The discrete type random variable, there have goodness of fit , independent test and homogenous test.
5. The 64 kinds probability distribution introduction in the initial level
6. finishing this program

確定 取消

The sample data is simulated in according to the requirements.

? [The Experiment design computation and images]
~~~~~ choose one ~~~~~

1. one way  $X(ij)=\mu(i)+e(ij)$ ,  $e(ij)$  are  $N(0,\sigma*\sigma)$
2. two way  $X(ij)=\mu(ij)+e(ij)$ ,  $e(ij)$  are  $N(0,\sigma*\sigma)$
3. two way and duplication  $X(ijk)=\mu(ij)+e(ijk)$ ,  $e(ijk)$  are  $N(0,\sigma*\sigma)$
4. one way & repeat measures  $X(ij)=\mu(ij)+e(ij)$ ,  $e(ij)$  are  $N(0,\sigma*\sigma)$
5. latin square  $X(ijk)=\mu(ijk)+e(ijk)$ ,  $e(ijk)$  are  $N(0,\sigma*\sigma)$
6. three way  $X(ijkl)=\mu(ijk)+e(ijkl)$ ,  $e(ijkl)$  are  $N(0,\sigma*\sigma)$
7. return

確定 取消

4.5.1) The number of factor A is 4 and the number of factor B is 3.

$$(A=4, B=5). X_{ij} = \mu + \alpha_i + \beta_j + \varepsilon_{ij}, i = 1, \dots, A, j = 1, \dots, B,$$

$$\alpha_1 = \alpha_2 = \dots = \alpha_A = 0, \beta_1 = \beta_2 = \dots = \beta_B = 0,$$

4.5.1.1) (A=4, B=5).  $X_{ij} = \mu + \alpha_i + \beta_j + \varepsilon_{ij}, i = 1, \dots, A, j = 1, \dots, B,$

$$\alpha_1 = \alpha_2 = \dots = \alpha_A = 0,$$

$$\mu = -10, \varepsilon_{ij} \sim \text{Normal distribution}, E(\varepsilon_{ij}) = 0, \text{Var}(\varepsilon_{ij}) = 625,$$

X(1,1)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(1,2)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(1,3)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(1,4)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(1,5)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(2,1)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(2,2)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(2,3)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(2,4)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(2,5)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(3,1)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(3,2)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(3,3)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(3,4)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(3,5)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(4,1)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(4,2)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(4,3)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(4,4)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5  
 X(4,5)~Normal(mu=-10.000000,sigma\*sigma=625.000000), sample size=5

The one way & repeated measures

$$X(ij) = \mu + \alpha(i) + \beta(j) + e(ij), i = 1, \dots, 4, j = 1, \dots, 5$$

$$\mu = -10.000000,$$

$$\alpha(1) = 0.000000, \alpha(2) = 0.000000, \alpha(3) = 0.000000, \alpha(4) = 0.000000,$$

$$e_{ij} \text{ iid } \sim \text{Normal}(0, \text{sigma} * \text{sigma} = 25.000000)$$

|    | A1             | A2             | A3             | A4             |
|----|----------------|----------------|----------------|----------------|
| B1 | -3.3190210134  | -12.5548779657 | -8.7045503611  | -12.7473242440 |
| B2 | -18.1506306991 | -12.0601782934 | -11.2226933395 | -9.7923320936  |
| B3 | -11.3719232517 | -12.5265421798 | -1.0400630358  | -4.6733034163  |
| B4 | -3.5981593613  | -1.4816464077  | -12.1618264368 | -13.2529463412 |
| B5 | -5.3891936464  | -14.9758269381 | -10.5608350087 | -4.4394103641  |

One way & repeated measures

$$X(ij) = \mu + \alpha(i) + \beta(j) + e(ij), i = 1, 2, \dots, 4, j = 1, 2, \dots, 5$$

|                      | A1       | A2        | A3       | A4       |
|----------------------|----------|-----------|----------|----------|
| factor A sample mean | -8.36579 | -10.71981 | -8.73799 | -8.98106 |
| alpha estimate value | 0.83538  | -1.51865  | 0.46317  | 0.22010  |

summation of alpha(i) = -0.000000

## ANOVA

| Source           | df | SS             | MS            | F            |
|------------------|----|----------------|---------------|--------------|
| Factor A         | 3  | 16.3356354732  | 5.4452118244  | 0.1861543633 |
| between repeated | 4  | 75.4668976613  |               |              |
| Error            | 12 | 351.0126796303 | 29.2510566359 |              |
| Total            | 19 | 442.8152127648 |               |              |

$H_0: \alpha(1) = \dots = \alpha(4) = 0$

F(3,12) test value = 0.186154

The F test p value = 0.903800

| class       | [ 1 ]    | [ 2 ]    | [ 3 ]    | [ 4 ]   | [ 5 ]   |
|-------------|----------|----------|----------|---------|---------|
| lower limit |          | -4.55180 | -1.37004 | 1.37009 | 4.55147 |
| upper limit | -4.55180 | -1.37004 | 1.37009  | 4.55147 |         |
| observed no | 5.00000  | 4.00000  | 2.00000  | 6.00000 | 3.00000 |
| probability | 0.20000  | 0.20000  | 0.20000  | 0.20000 | 0.20000 |
| expected no | 4.00000  | 4.00000  | 4.00000  | 4.00000 | 4.00000 |
| chi square  | 0.25000  | 0.00000  | 1.00000  | 1.00000 | 0.25000 |

degree of freedom = 3

$H_0$ : residual ~ Normal(0,  $\sigma(\text{error}) * \sigma(\text{error})$ ),  $\sigma(\text{error})$  are unknown  
 pearson chi-square test statistic = 2.500000

p-value = 0.475200

$H_0$ : Variances are equal

Max(residual(ij) \* residual(ij) / SSE) = test value = 0.167189

p value = 0.866613

~~~~~ The run test of residual ~~~~~

number of the negative of residual = 9

number of the positive of residual = 11

Run = 11

H_0 : residual is random, H_1 : Increasing line or decreasing line

Z = 0.046437, p-value = 0.518600

H_0 : residual is random, H_1 : Oscillation

Z = 0.046437, p-value = 0.481400

H_0 : residual is random, H_1 : Increasing line or decreasing line or Oscillation

Z = 0.046437, p-value = 0.962800

multiple comparison of population means

Factor A, there has 4 categories

. LSD (least significant difference)

The confidence coefficient = 0.95

95% C.I. for $\mu(1) - \mu(2)$

[-5.0983267467, 9.80638427180]

$\mu(1) = \mu(2)$

95% C.I. for $\mu(1) - \mu(3)$

[-7.0801474673, 7.82456355120]

$\mu(1) = \mu(3)$

95% C.I. for $\mu(1)-\mu(4)$
 [-6.8370778118, 8.06763320670]
 $\mu(1)=\mu(4)$

95% C.I. for $\mu(2)-\mu(3)$
 [-9.4341762298, 5.47053478870]
 $\mu(2)=\mu(3)$

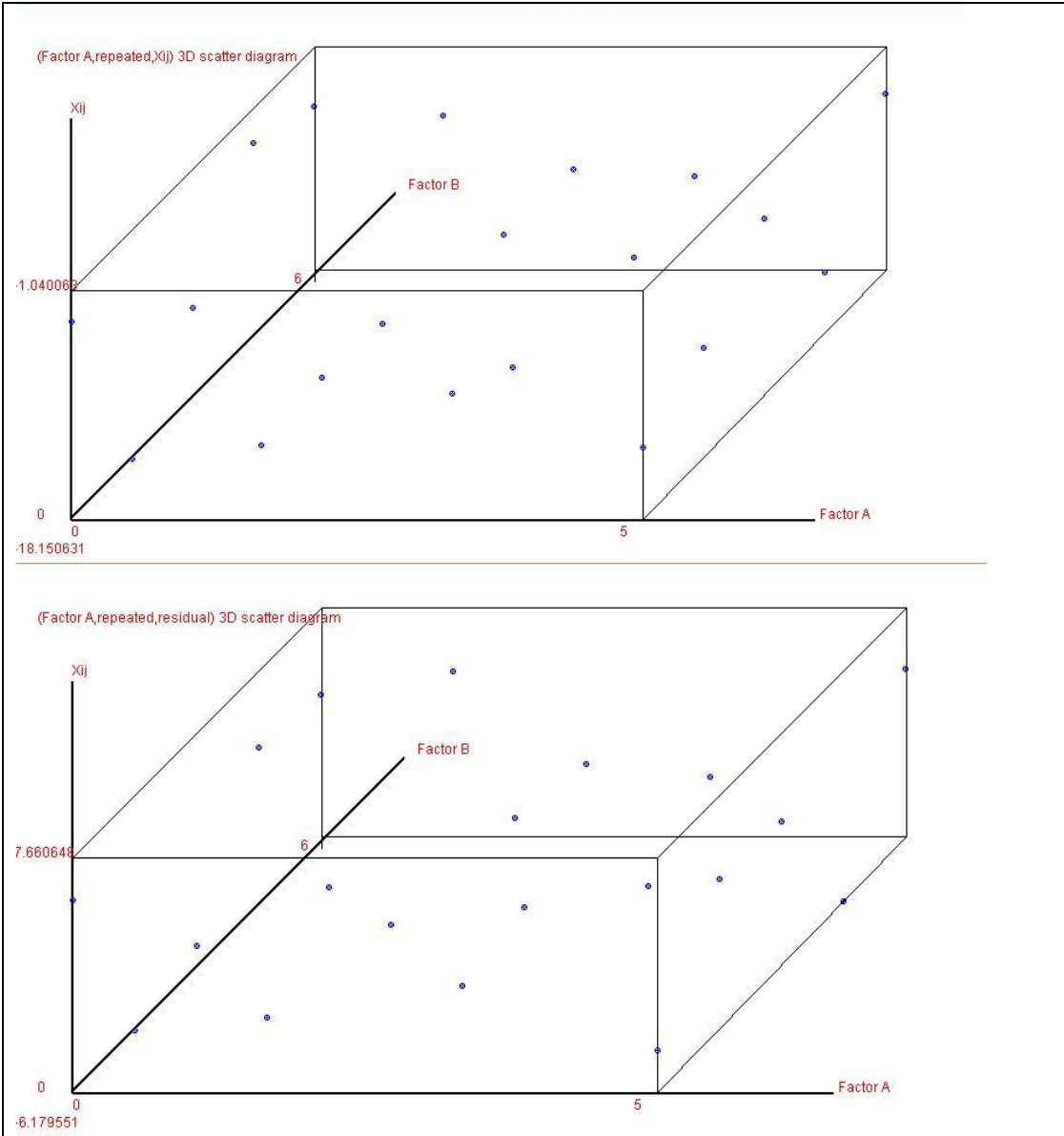
95% C.I. for $\mu(2)-\mu(4)$
 [-9.1911065743, 5.71360444410]
 $\mu(2)=\mu(4)$

95% C.I. for $\mu(3)-\mu(4)$
 [-7.2092858537, 7.69542516470]
 $\mu(3)=\mu(4)$

~~~~~ error ~~~~~

|          |          |          |          |
|----------|----------|----------|----------|
| 5.17704  | -1.70478 | 0.16372  | -3.63598 |
| -6.17955 | 2.26493  | 1.12059  | 2.79403  |
| -4.80434 | -3.60493 | 5.89972  | 2.50955  |
| 3.19011  | 7.66065  | -5.00135 | -5.84940 |
| 2.61674  | -4.61586 | -2.18269 | 4.18181  |

The common population standard deviation and variance confidence interval  
 90% confidence interval for population variance  
 [16.694230 , 67.166788]  
 90% confidence interval for population standard deviation  
 [4.085857 , 8.195535]  
 95% confidence interval for population variance  
 [15.041023 , 79.706914]  
 95% confidence interval for population standard deviation  
 [3.878276 , 8.927873]  
 99% confidence interval for population variance  
 [12.403121 , 114.192317]  
 99% confidence interval for population standard deviation  
 [3.521807 , 10.686081]



4.5.1.2) (A=4,B=5).  $X_{ij} = \mu + \alpha_i + \beta_j + \varepsilon_{ij}, i = 1, \dots, A, j = 1, \dots, B,$

$$\alpha_1 = 4, \alpha_2 = 5, \alpha_3 = 10, \alpha_4 = 12,$$

$$\mu = -10, \varepsilon_{ij} \sim \text{Uniform distribution}, E(\varepsilon_{ij}) = 0, \text{Var}(\varepsilon_{ij}) = 25,$$

X(1,1)~Normal(mu=-6.000000,sigma\*sigma=25.000000), sample size=5  
 X(1,2)~Normal(mu=-6.000000,sigma\*sigma=25.000000), sample size=5  
 X(1,3)~Normal(mu=-6.000000,sigma\*sigma=25.000000), sample size=5  
 X(1,4)~Normal(mu=-6.000000,sigma\*sigma=25.000000), sample size=5  
 X(1,5)~Normal(mu=-6.000000,sigma\*sigma=25.000000), sample size=5  
 X(2,1)~Normal(mu=-5.000000,sigma\*sigma=25.000000), sample size=5  
 X(2,2)~Normal(mu=-5.000000,sigma\*sigma=25.000000), sample size=5  
 X(2,3)~Normal(mu=-5.000000,sigma\*sigma=25.000000), sample size=5  
 X(2,4)~Normal(mu=-5.000000,sigma\*sigma=25.000000), sample size=5  
 X(2,5)~Normal(mu=-5.000000,sigma\*sigma=25.000000), sample size=5  
 X(3,1)~Normal(mu=0.000000,sigma\*sigma=25.000000), sample size=5  
 X(3,2)~Normal(mu=0.000000,sigma\*sigma=25.000000), sample size=5  
 X(3,3)~Normal(mu=0.000000,sigma\*sigma=25.000000), sample size=5  
 X(3,4)~Normal(mu=0.000000,sigma\*sigma=25.000000), sample size=5  
 X(3,5)~Normal(mu=0.000000,sigma\*sigma=25.000000), sample size=5  
 X(4,1)~Normal(mu=2.000000,sigma\*sigma=25.000000), sample size=5  
 X(4,2)~Normal(mu=2.000000,sigma\*sigma=25.000000), sample size=5  
 X(4,3)~Normal(mu=2.000000,sigma\*sigma=25.000000), sample size=5  
 X(4,4)~Normal(mu=2.000000,sigma\*sigma=25.000000), sample size=5  
 X(4,5)~Normal(mu=2.000000,sigma\*sigma=25.000000), sample size=5

The one way & repeated measures

$$X(ij)=\mu+\alpha(i)+\beta(j)+e(ij),i=1,\dots,4, j=1,\dots,5$$

$$\mu=-10.000000,$$

$$\alpha(1)=4.000000, \alpha(2)=5.000000, \alpha(3)=10.000000, \alpha(4)=12.000000,$$

$$e_{ij} \text{ iid } \sim \text{Normal}(0, \text{sigma} * \text{sigma} = 5.000000)$$

|    | A1             | A2            | A3            | A4            |
|----|----------------|---------------|---------------|---------------|
| B1 | -5.2548236901  | -6.5104277192 | -3.1013078945 | 5.2836194915  |
| B2 | -10.9002114413 | -5.1519132808 | 0.9326308555  | 1.2226114453  |
| B3 | -6.0224612809  | -0.4133497419 | 0.9281081007  | 2.3512276751  |
| B4 | -4.1543495200  | -8.2652057448 | -1.2734966540 | 2.0019190065  |
| B5 | -7.9356213969  | -3.9933408012 | 2.8363629840  | -0.9107740844 |

One way & repeated measures

$$X(ij)=\mu+\alpha(i)+\beta(j)+e(ij), i=1,2,\dots,4, j=1,2,\dots,5$$

|                      | A1       | A2       | A3      | A4      |
|----------------------|----------|----------|---------|---------|
| factor A sample mean | -6.85349 | -4.86685 | 0.06446 | 1.98972 |
| alpha estimate value | -4.43695 | -2.45031 | 2.48100 | 4.40626 |

summation of alpha(i)=0.000000



**ANOVA**

| Source           | df | SS             | MS            | F             |
|------------------|----|----------------|---------------|---------------|
| Factor A         | 3  | 256.3052726117 | 85.4350908706 | 11.6688117695 |
| between repeated | 4  | 16.1240403734  |               |               |
| Error            | 12 | 87.8599390154  | 7.3216615846  |               |
| Total            | 19 | 360.2892520005 |               |               |

H0:alpha(1)=...=alpha(4)=0  
 F(3,12) test value=11.668812

The F test p value=0.000800

| class       | [ 1 ]    | [ 2 ]    | [ 3 ]    | [ 4 ]   | [ 5 ]   |
|-------------|----------|----------|----------|---------|---------|
| lower limit |          | -2.27729 | -0.68544 | 0.68546 | 2.27712 |
| upper limit | -2.27729 | -0.68544 | 0.68546  | 2.27712 |         |
| observed no | 4.00000  | 6.00000  | 2.00000  | 4.00000 | 4.00000 |
| probability | 0.20000  | 0.20000  | 0.20000  | 0.20000 | 0.20000 |
| expected no | 4.00000  | 4.00000  | 4.00000  | 4.00000 | 4.00000 |
| chi square  | 0.00000  | 1.00000  | 1.00000  | 0.00000 | 0.00000 |

degree of freedom=3

H0: residual~Normal(0,sigma(error)\*sigma(error)), sigma(error) are unknown  
 pearson chi-square test statistic =2.000000  
 p-value=0.572400

H0: Variances are equal  
 Max(residual(ij)\*residual(ij)/SSE=test value=0.121934  
 p value=0.995150

~~~~~ The run test of residual~~~~~

number of the negative of residual=10
 number of the positive ofresidual=10
 Run=12
 H0: residualis random , H1: Increasing line or decreasing line
 Z=0.459468, p-value=0.677100
 H0: residual is random , H1: Oscillation
 Z=0.459468, p-value=0.322900
 H0: residual is random , H1: Increasing line or decreasing line or Oscillation
 Z=0.459468, p-value=0.645800

multiple comparison of population means

Factor A ,there has 4 cateogries
 . LSD(least significant difference)
 The confidence coefficietn=0.95
 95% C.I. for mu(1)-mu(2)
 [-5.7150898903, 1.74179787380]
 mu(1)=mu(2)

95% C.I. for $\mu(1)-\mu(3)$
 [-10.6463968262, -3.18950906210]
 $\mu(1)<\mu(3)$
 95% C.I. for $\mu(1)-\mu(4)$
 [-12.5716580547, -5.11477029060]
 $\mu(1)<\mu(4)$
 95% C.I. for $\mu(2)-\mu(3)$
 [-8.6597508180, -1.20286305380]
 $\mu(2)<\mu(3)$
 95% C.I. for $\mu(2)-\mu(4)$
 [-10.5850120465, -3.12812428230]
 $\mu(2)<\mu(4)$
 95% C.I. for $\mu(3)-\mu(4)$
 [-5.6537051106, 1.80318265360]
 $\mu(3)=\mu(4)$

~~~~~ error ~~~~~

|          |          |          |          |
|----------|----------|----------|----------|
| 1.57786  | -1.66439 | -3.18657 | 3.27309  |
| -2.98904 | 0.77261  | 1.92585  | 0.29057  |
| -0.79639 | 2.82608  | -0.76377 | -1.26591 |
| 3.20539  | -2.89212 | -0.83171 | 0.51844  |
| -0.99782 | 0.95781  | 2.85621  | -2.81619 |

The common population standard deviation and variance confidence interval  
 90% confidence interval for population variance  
 [4.178636 , 16.812127]  
 90% confidence interval for population standard deviation  
 [2.044171 , 4.100259]  
 95% confidence interval for population variance  
 [3.764831 , 19.950973]  
 95% confidence interval for population standard deviation  
 [1.940317 , 4.466651]  
 99% confidence interval for population variance  
 [3.104553 , 28.582814]  
 99% confidence interval for population standard deviation  
 [1.761974 , 5.346290]

