

## SAS Examples of Chapter 3

### Example 3.1

Perspiration from 20 healthy females was analyzed. Three components,  $X_1$  = sweat rate,  $X_2$  = sodium content, and  $X_3$  = potassium content, were measured, and the results are presented in the following table.

Individual	$X_1$	$X_2$	$X_3$	Individual	$X_1$	$X_2$	$X_3$
1	3.7	48.5	9.3	11	3.9	36.9	12.7
2	5.7	65.1	8.0	12	4.5	58.8	12.3
3	3.8	47.2	10.9	13	3.5	27.8	9.8
4	3.2	53.2	12.0	14	4.5	40.2	8.4
5	3.1	55.5	9.7	15	1.5	13.5	10.1
6	4.6	36.1	7.9	16	8.5	56.4	7.1
7	2.4	24.8	14.0	17	4.5	71.6	8.2
8	7.2	33.1	7.6	18	6.5	52.8	10.9
9	6.7	47.4	8.5	19	4.1	44.1	11.2
10	5.4	54.1	11.3	20	5.5	40.9	9.4

- (a) Set  $\alpha = 0.10$ , perform a test for each of the following hypothesis:
- (i)  $H_0 : \mu_1 = 4$  vs  $H_1 : \mu_1 \neq 4$ ,
  - (ii)  $H_0 : \mu_2 = 50$  vs  $H_1 : \mu_2 \neq 50$ ,
  - (iii)  $H_0 : \mu_3 = 10$  vs  $H_1 : \mu_3 \neq 10$ .
- (b) Set  $\alpha = 0.10$ , perform a test for  $H_0 : \boldsymbol{\mu} = (4, 50, 10)'$  vs  $H_1 : \boldsymbol{\mu} \neq (4, 50, 10)'$ .
- (c) Construct 90% Bonferroni confidence intervals for  $\mu_1, \mu_2, \mu_3$ .
- (d) Construct 90% Scheffé confidence intervals for  $\mu_1, \mu_2, \mu_3$ .

### Solution

(a) From the observations, we have

$$\bar{\mathbf{x}} = \begin{pmatrix} 4.64 \\ 45.4 \\ 9.9650 \end{pmatrix} \quad \text{and} \quad \mathbf{S} = \begin{pmatrix} 2.8794 & 10.0101 & -1.8091 \\ 10.0100 & 199.7884 & -5.6400 \\ -1.8091 & -5.6400 & 3.6277 \end{pmatrix}.$$

(i) To test  $H_0 : \mu_1 = 4$  vs  $H_1 : \mu_1 \neq 4$ , the computed  $t$ -statistic is

$$t = \frac{4.64 - 4}{\sqrt{2.8794/20}} = 1.6867$$

and its  $p$ -value is  $0.1080 > 0.10$ . Thus, the null hypothesis cannot be rejected at 10% significance level.

(ii) To test  $H_0 : \mu_2 = 50$  vs  $H_1 : \mu_2 \neq 50$ , the computed  $t$ -statistic is

$$t = \frac{45.4 - 50}{\sqrt{199.7884/20}} = -1.4554$$

and its  $p$ -value is  $0.1619 > 0.10$ . Thus, the null hypothesis cannot be rejected at 10% significance level.

(iii) Test  $H_0 : \mu_3 = 10$  vs  $H_1 : \mu_3 \neq 10$ , the computed  $t$ -statistic is

$$t = \frac{9.9650 - 10}{\sqrt{3.6277/20}} = -0.0822$$

and its  $p$ -value is  $0.9354 > 0.10$ . Thus, the null hypothesis cannot be rejected at 10% significance level.

(b) To test  $H_0 : \boldsymbol{\mu} = (4, 50, 10)'$  vs  $H_1 : \boldsymbol{\mu} \neq (4, 50, 10)'$ , the computed  $T^2$ -statistic is

$$\begin{aligned} T^2 &= 20 \times \begin{pmatrix} 4.64 - 4 \\ 45.4 - 50 \\ 9.9650 - 10 \end{pmatrix}' \begin{pmatrix} 2.8794 & 10.0101 & -1.8091 \\ 10.0100 & 199.7884 & -5.6400 \\ -1.8091 & -5.6400 & 3.6277 \end{pmatrix}^{-1} \begin{pmatrix} 4.64 - 4 \\ 45.4 - 50 \\ 9.9650 - 10 \end{pmatrix} \\ &= 9.7388 \end{aligned}$$

which is greater than the critical value  $CV = \frac{(20-1)(3)}{20-3} F_{0.10}(3, 20-3) = 8.1726$  and the corresponding  $p$ -value is  $0.0649 < 0.10$ . Thus, the null hypothesis is rejected at 10% significance level.

(c) By putting  $\mathbf{a} = (1, 0, 0)'$ ,  $\mathbf{a} = (0, 1, 0)'$  and  $\mathbf{a} = (0, 0, 1)'$  for the confidence intervals of  $\mu_1$ ,  $\mu_2$  and  $\mu_3$  respectively, the 90% Bonferroni confidence intervals are

	Lower Bound	Upper Bound
$\mu_1$	3.7694	5.5106
$\mu_2$	38.1483	52.6517
$\mu_3$	8.9878	10.9422

Note that  $m = 3$  in this case.

(d) By putting  $\mathbf{a} = (1, 0, 0)'$ ,  $\mathbf{a} = (0, 1, 0)'$  and  $\mathbf{a} = (0, 0, 1)'$  for  $\mu_1$ ,  $\mu_2$  and  $\mu_3$  respectively, the 90% simultaneous (Scheffé) confidence intervals are

	Lower Bound	Upper Bound
$\mu_1$	3.5553	5.7247
$\mu_2$	36.3646	54.4354
$\mu_3$	8.7475	11.1825

### Example 3.2

(a) Suppose there is an ‘anthropometric law’ which states that the means of height, chest circumference and MUAC (mid-upper-arm circumference) are in the ratios 6:4:1 and we wish to test whether or not our data are consistent with this law.

Individual	Height (cm)	Chest circumference (cm)	MUAC (cm)
1	78	60.6	16.5
2	76	58.1	12.5
3	92	63.2	14.5
4	81	59.0	14.0
5	81	60.8	15.5
6	84	59.5	14.0

(b) The table given previously refers to a sample of approximately two-year-old boys from a country in Asia while the following table gives data for approximately two-year-old girls from the same country.

Individual	Height (cm)	Chest circumference (cm)	MUAC (cm)
1	80	58.4	14.0
2	75	59.2	15.0
3	78	60.3	15.0
4	75	57.4	13.0
5	79	59.5	14.0
6	78	58.1	14.5
7	75	58.0	12.5
8	64	55.5	11.0
9	80	59.2	12.5

Test the hypothesis that there is no difference in the means of height, chest circumference and MUAC for two-year-old boys and girls at 0.01 significance level.

### Solution

(a) Test  $H_0 : \frac{1}{6}\mu_1 = \frac{1}{4}\mu_2 = \mu_3$ . Under  $H_0$ , the relationship between  $\mu_1$  and  $\mu_2$  can be represented by

$$2\mu_1 - 3\mu_2 = 0.$$

The relationship between  $\mu_1$  and  $\mu_3$  can be represented by

$$\mu_1 - 6\mu_3 = 0.$$

Then, the null hypothesis can be rewritten as

$$H_0 : \begin{pmatrix} 2 & -3 & 0 \\ 1 & 0 & -6 \end{pmatrix} \begin{pmatrix} \mu_1 \\ \mu_2 \\ \mu_3 \end{pmatrix} = \mathbf{0} \quad \text{or} \quad \mathbf{C}\boldsymbol{\mu} = \mathbf{0}.$$

From the observations of boys, we can have

$$n_1 = 6, \bar{\mathbf{x}}_1 = \begin{pmatrix} 82.0 \\ 60.2 \\ 14.5 \end{pmatrix}, \mathbf{S}_1 = \begin{pmatrix} 31.600 & 8.040 & 0.500 \\ 8.040 & 3.172 & 1.310 \\ 0.500 & 1.310 & 1.900 \end{pmatrix}.$$

The computed test statistic is

$$T^2 = 47.1434 > CV = 45.$$

Also, its corresponding  $p$ -value is  $0.0092 < 0.01$ . Thus, the null hypothesis is rejected at 1% significance level.

(b) From the observations of girls, we can have

$$n_2 = 9, \bar{\mathbf{x}}_2 = \begin{pmatrix} 76.0 \\ 58.4 \\ 13.5 \end{pmatrix}, \mathbf{S}_2 = \begin{pmatrix} 24.5000 & 5.6375 & 4.3125 \\ 5.6375 & 1.9700 & 1.4562 \\ 4.3125 & 1.4562 & 1.8125 \end{pmatrix}.$$

The pooled estimate of  $\Sigma$  is

$$\mathbf{S} = \frac{(n_1 - 1)\mathbf{S}_1 + (n_2 - 1)\mathbf{S}_2}{n_1 + n_2 - 2} = \begin{pmatrix} 27.2308 & 6.5615 & 2.8462 \\ 6.5615 & 2.4323 & 1.4000 \\ 2.8462 & 1.4000 & 1.8462 \end{pmatrix}.$$

Now, we test  $H_0 : \boldsymbol{\mu}_1 = \boldsymbol{\mu}_2$  and the computed test statistic is

$$\begin{aligned} T^2 &= \frac{(6)(9)}{6+9} \begin{pmatrix} 82.0 - 76.0 \\ 60.2 - 58.4 \\ 14.5 - 13.5 \end{pmatrix}' \begin{pmatrix} 27.2308 & 6.5615 & 2.8462 \\ 6.5615 & 2.4323 & 1.4000 \\ 2.8462 & 1.4000 & 1.8462 \end{pmatrix}^{-1} \begin{pmatrix} 82.0 - 76.0 \\ 60.2 - 58.4 \\ 14.5 - 13.5 \end{pmatrix} \\ &= 5.3117 \end{aligned}$$

which is smaller than the critical value  $CV = \frac{(6+9-2)(3)}{6+9-3-1} F_{0.01}(3, 6+9-3-1) = 22.0411$ . Also, its corresponding  $p$ -value is  $0.2693 > 0.01$ . Thus, the null hypothesis cannot be rejected at 1% significance level.

## SAS Codes for Example 3.1

```

1  proc iml;
2      x = {3.7 48.5 9.3,
3           5.7 65.1 8.0,
4           3.8 47.2 10.9,
5           3.2 53.2 12.0,
6           3.1 55.5 9.7,
7           4.6 36.1 7.9,
8           2.4 24.8 14.0,
9           7.2 33.1 7.6,
10          6.7 47.4 8.5,
11          5.4 54.1 11.3,
12          3.9 36.9 12.7,
13          4.5 58.8 12.3,
14          3.5 27.8 9.8,
15          4.5 40.2 8.4,
16          1.5 13.5 10.1,
17          8.5 56.4 7.1,
18          4.5 71.6 8.2,
19          6.5 52.8 10.9,
20          4.1 44.1 11.2,
21          5.5 40.9 9.4 };
22
23      n = nrow(x);
24      p = ncol(x);
25      xbar = x[,,]';
26      S = (x'*x - n*xbar*xbar')/(n-1);
27      print xbar[format=10.4] S[format=10.4];
28
29      mu0 = {4, 50, 10};
30
31      /* part (a) */
32      /* (i) */
33      tstat = (xbar[1]-mu0[1])/sqrt(S[1,1]/n);
34      pval = 2*(1-probt(abs(tstat),n-1));
35      print "Test for mu1=4",, tstat[format=10.4] pval[format=10.4];
36
37      /* (ii) */
38      tstat = (xbar[2]-mu0[2])/sqrt(S[2,2]/n);
39      pval = 2*(1-probt(abs(tstat),n-1));
40      print "Test for mu2=50",, tstat[format=10.4] pval[format=10.4];
41
42      /* (iii) */
43      tstat = (xbar[3]-mu0[3])/sqrt(S[3,3]/n);
44      pval = 2*(1-probt(abs(tstat),n-1));
45      print "Test for mu3=10",, tstat[format=10.4] pval[format=10.4];
46
47      /* part (b) */
48      tsq = n*(xbar-mu0)'*inv(S)*(xbar-mu0);
49      alpha = 0.1;
50      cv = (n-1)*p/(n-p)*finv(1-alpha,p,n-p);
51      pval = 1-probf((n-p)/(p*(n-1))*tsq,p,n-p);
52      print tsq[format=10.4] cv[format=10.4] pval[format=10.4];
53

```

```
54  /* part (c), calculation of Bonferroni C.I. */
55  a = {1,0,0};
56  merror = abs(tinv(alpha/(2*3),n-1))*sqrt(a'*S*a/n);
57  ci1 = (a'*xbar-merror)||(a'*xbar+merror);
58  a = {0,1,0};
59  merror = abs(tinv(alpha/(2*3),n-1))*sqrt(a'*S*a/n);
60  ci2 = (a'*xbar-merror)||(a'*xbar+merror);
61  a = {0,0,1};
62  merror = abs(tinv(alpha/(2*3),n-1))*sqrt(a'*S*a/n);
63  ci3 = (a'*xbar-merror)||(a'*xbar+merror);
64
65  ci = ci1//ci2//ci3;
66  r = {"mu1" "mu2" "mu3"};
67  c = {"Lower Bound" "Upper Bound"};
68
69  print ci[label="90% Bonferroni C.I.s" rowname=r colname=c format=10.4];
70
71  /* part (d), calculation of Scheffe C.I. */
72  a = {1,0,0};
73  merror = sqrt(cv)*sqrt(a'*S*a/n);
74  ci1 = (a'*xbar-merror)||(a'*xbar+merror);
75  a = {0,1,0};
76  merror = sqrt(cv)*sqrt(a'*S*a/n);
77  ci2 = (a'*xbar-merror)||(a'*xbar+merror);
78  a = {0,0,1};
79  merror = sqrt(cv)*sqrt(a'*S*a/n);
80  ci3 = (a'*xbar-merror)||(a'*xbar+merror);
81
82  ci = ci1//ci2//ci3;
83  r = {"mu1" "mu2" "mu3"};
84  c = {"Lower Bound" "Upper Bound"};
85
86  print ci[label="90% Simultaneous C.I.s" rowname=r colname=c format=10.4];
87
88 quit;
```

## SAS Codes for Example 3.2

```

1 proc iml;
2 /* part (a) */
3   x1 = {78 60.6 16.5,
4         76 58.1 12.5,
5         92 63.2 14.5,
6         81 59.0 14.0,
7         81 60.8 15.5,
8         84 59.5 14.0 };
9   n1 = nrow(x1);
10  mean1 = x1[:,]';
11  W1 = (x1'*x1 - n1*mean1*mean1');
12  S1 = W1/(n1-1);
13  print n1[format=5.0] mean1[format=10.4] S1[format=10.4] W1[format=10.4];
14
15  alpha = 0.01;
16  c = {2 -3 0,
17       1 0 -6};
18  q = nrow(c);
19  tsq = n1*(c*mean1)'*inv(c*s1*c')*(c*mean1);
20  cv = (n1-1)*q/(n1-q)*finv(1-alpha,q,n1-q);
21  pval = 1-probf(tsq*(n1-q)/(q*(n1-1)),q,n1-q);
22  print tsq[format=10.4] cv[format=10.4] pval[format=10.4];
23
24  /* part (b) */
25  x2 = { 80 58.4 14.0,
26        75 59.2 15.0,
27        78 60.3 15.0,
28        75 57.4 13.0,
29        79 59.5 14.0,
30        78 58.1 14.5,
31        75 58.0 12.5,
32        64 55.5 11.0,
33        80 59.2 12.5};
34  n2 = nrow(x2);
35  mean2 = x2[:,]';
36  W2 = x2'*x2 - n2*mean2*mean2';
37  S2 = W2/(n2-1);
38  print n2[format=5.0] mean2[format=10.4] S2[format=10.4] W2[format=10.4];
39
40  S = (W1+W2)/(n1+n2-2);
41  print S[format=10.4];
42
43  alpha = 0.01;
44  p = nrow(S1);
45  tsq = n1*n2/(n1+n2)*(mean1-mean2)'*inv(s)*(mean1-mean2);
46  m = n1+n2-p-1;
47  cv = (n1+n2-2)*p/m*finv(1-alpha,p,m);
48  pval = 1-probf(tsq*m/((n1+n2-2)*p),p,m);
49  print tsq[format=10.4] cv[format=10.4] pval[format=10.4];
50
51 quit;

```