

For the following *R* problems perform the perform the *source("J:/mpack.txt")* and *source("J:/mrobddata.txt")* commands as described in homework 3. Also copy and paste commands from (<http://parker.ad.siu.edu/Olive/mrsashw.txt>) for the relevant problem into *R*.

A), 10.2 SAS Institute (1985, p. 498 - 501) describes a one way MANOVA model. There are two groups for gender: female and male. There were $p = 4$ (skull measurements) variables $X_1 = \text{length}$, $X_2 = \text{basilar}$, $X_3 = \text{zygomat}$ and $X_4 = \text{postorb}$. There were $n_1 = 18$ females and $n_2 = 22$ males measured. Suppose $t_0 = 0.9567$ and $p\text{value} = 0.6566$. Here t_0 was Wilk's lambda, but the other three test statistics gave the same $p\text{value}$. Do a 4 step one way MANOVA test.

B) Suppose the 15 units are 1 Adatorwovor, 2 Adhikari, 3 Alanzi, 4 Alsibiani, 5 Al-Talib, 6 Fan, 7 Kuo, 8 Lamsal, 9 Liu, 10 Meyer, 11 Peiris, 12 Rathnayake, 13 Rupasinghe, 14 Schroepel and 15 Watagoda. Use the following output to allocate the 15 units to three groups of 5. Show the three groups.

```
> sample(15)
[1] 6 3 4 2 1 10 7 5 12 15 13 8 14 11 9
```

C), 11.4 The Buxton data has 5 massive outliers in variables len and $\text{buxy} = \text{height}$.

a) The *R* commands for this part do a factor analysis on the Buxton data using the sample covariance matrix. Copy and paste the output into *Word*.

- i) Which variables have nonzero loadings for factor 1?
- ii) Which variables have nonzero loadings for factor 2?
- iii) What is the cumulative variance explained by the two factors?

b) The *R* commands for this part do a factor analysis on the Buxton data using the RMVN dispersion matrix. Copy and paste the output into *Word*.

- i) Which variables have nonzero loadings for factor 1?
- ii) Which variables have nonzero loadings for factor 2?
- iii) What is the cumulative variance explained by the two factors?

D) Refer to the factor analysis handout where the factor analysis is applied using covariance matrix *ability.cov*.

- a) Is one factor enough or are two factors needed?
- b) For the analysis which used two factors, which factor corresponds to reading and vocabulary?
- c) For the analysis which used two factors, which factor had the two smallest loadings on variables reading and vocabulary?

E), 12.1 Consider the Hotelling Lawley test statistic.

Let

$$T(\mathbf{W}) = n [\text{vec}(\mathbf{L}\hat{\mathbf{B}})]^T [\hat{\Sigma}_{\boldsymbol{\epsilon}}^{-1} \otimes (\mathbf{L}\mathbf{W}\mathbf{L}^T)^{-1}] [\text{vec}(\mathbf{L}\hat{\mathbf{B}})].$$

Let

$$\frac{\mathbf{X}^T \mathbf{X}}{n} = \hat{\mathbf{W}}^{-1}.$$

Show $T(\hat{\mathbf{W}}) = [\text{vec}(\mathbf{L}\hat{\mathbf{B}})]^T [\hat{\Sigma}_{\boldsymbol{\epsilon}}^{-1} \otimes (\mathbf{L}(\mathbf{X}^T \mathbf{X})^{-1} \mathbf{L}^T)^{-1}] [\text{vec}(\mathbf{L}\hat{\mathbf{B}})]$.

F), 12.2 Consider the Hotelling Lawley test statistic. Let

$T = [\text{vec}(\mathbf{L}\hat{\mathbf{B}})]^T [\hat{\Sigma}_{\boldsymbol{\epsilon}}^{-1} \otimes (\mathbf{L}(\mathbf{X}^T \mathbf{X})^{-1} \mathbf{L}^T)^{-1}] [\text{vec}(\mathbf{L}\hat{\mathbf{B}})]$. Let $\mathbf{L} = \mathbf{L}_j = [0, \dots, 0, 1, 0, \dots, 0]$ have a 1 in the j th position. Let $\hat{\mathbf{b}}_j^T = \mathbf{L}_j \hat{\mathbf{B}}$ be the j th row of $\hat{\mathbf{B}}$. Let $d_j = \mathbf{L}_j (\mathbf{X}^T \mathbf{X})^{-1} \mathbf{L}_j^T = (\mathbf{X}^T \mathbf{X})_{jj}^{-1}$, the j th diagonal entry of $(\mathbf{X}^T \mathbf{X})^{-1}$. Then $T_j = \frac{1}{d_j} \hat{\mathbf{b}}_j^T \hat{\Sigma}_{\boldsymbol{\epsilon}}^{-1} \hat{\mathbf{b}}_j$. The Hotelling Lawley statistic $U = \text{tr}([(n-p)\hat{\Sigma}_{\boldsymbol{\epsilon}}]^{-1} \hat{\mathbf{B}}^T \mathbf{L}^T [\mathbf{L}(\mathbf{X}^T \mathbf{X})^{-1} \mathbf{L}^T]^{-1} \mathbf{L} \hat{\mathbf{B}})$. Hence if $\mathbf{L} = \mathbf{L}_j$, then $U_j = \frac{1}{d_j(n-p)} \text{tr}(\hat{\Sigma}_{\boldsymbol{\epsilon}}^{-1} \hat{\mathbf{b}}_j \hat{\mathbf{b}}_j^T)$.

Using $\text{tr}(\mathbf{ABC}) = \text{tr}(\mathbf{CAB})$ and $\text{tr}(a) = a$ for scalar a , show the $(n-p)U_j = T_j$.

```

#Factor Analysis handout
> out1 <- factanal(x, factors = 3)
Uniquenesses:  v1    v2    v3    v4    v5    v6
                0.005 0.101 0.005 0.224 0.084 0.005

Loadings:
  Factor1 Factor2 Factor3
v1 0.944  0.182  0.267
v2 0.905  0.235  0.159
v3 0.236  0.210  0.946
v4 0.180  0.242  0.828
v5 0.242  0.881  0.286
v6 0.193  0.959  0.196

                Factor1 Factor2 Factor3
SS loadings      1.893  1.886  1.797
Proportion Var   0.316  0.314  0.300
Cumulative Var   0.316  0.630  0.929
#used varimax rotation
#factor 1 is almost an average of v1 and v2
#factor 2 is almost an average of v5 and v6
#factor 3 is almost an average of v3 and v4

> out2 <- factanal(x, factors = 3, rotation = "promax")
> out2
Uniquenesses:  v1    v2    v3    v4    v5    v6
                0.005 0.101 0.005 0.224 0.084 0.005

Loadings:  Factor1  Factor2  Factor3
          v1           0.985
          v2           0.951
          v3                1.003
          v4                0.867
          v5 0.910
          v6 1.033

                Factor1 Factor2 Factor3
SS loadings      1.903  1.876  1.772
Proportion Var   0.317  0.313  0.295
Cumulative Var   0.317  0.630  0.925
##promax rotation tries to give 0 loadings to lots of variables
##in the factor

##Factor analysis can also be performed by supplying
##a covariance matrix or a correlation matrix.
##As a diagnostic, supply the RMVN dispersion matrix or
##the RMVN generalized correlation matrix.

> out1 <- factanal(factors = 1, covmat=ability.cov)

```

```

> out1
Uniquenesses:
general picture  blocks    maze reading  vocab
  0.535  0.853  0.748  0.910  0.232  0.280

Loadings: Factor1
general    0.682
picture   0.384
blocks    0.502
maze      0.300
reading   0.877
vocab     0.849

                Factor1
SS loadings    2.443
Proportion Var 0.407

Test of the hypothesis that 1 factor is sufficient.
The chi square statistic is 75.18 on 9 degrees of freedom.
The p-value is 1.46e-12
>
> out2 <- factanal(factors = 2, covmat=ability.cov)
> out2

Uniquenesses:
general picture  blocks    maze reading  vocab
  0.455  0.589  0.218  0.769  0.052  0.334

Loadings: Factor1 Factor2
general 0.499  0.543
picture 0.156  0.622
blocks  0.206  0.860
maze    0.109  0.468
reading 0.956  0.182
vocab   0.785  0.225

                Factor1 Factor2
SS loadings    1.858  1.724
Proportion Var 0.310  0.287
Cumulative Var 0.310  0.597

Test of the hypothesis that 2 factors are sufficient.
The chi square statistic is 6.11 on 4 degrees of freedom.
The p-value is 0.191
##Want pvalue > 0.05 to suggest that there are enough factors.

```