Chapter 14: Answers

Task 1

A clinical psychologist noticed that several of his manic psychotic patients did chicken impersonations in public. He wondered whether this behaviour could be used to diagnose this disorder and so decided to compare his patients against a normal sample. He observed 10 of his patients as they went through a normal day. He also needed to observe 10 of the most normal people he could find: naturally he chose to observe lecturers at the University of Sussex. He all participants using two dependent variables: first, how many chicken impersonations they did in the streets of Brighton over the course of a day, and second, how good their impersonations were (as scored out of 10 by an independent farmyard noise expert). The data are in the file **chicken.sav**, use MANOVA and DFA to find out whether these variables could be used to distinguish manic psychotic patients from those without the disorder.

SPSS Output

Preliminary Analysis and Testing Assumptions

This output shows an initial table of descriptive statistics that is produced by clicking on the descriptive statistics option in the *options* dialog box. This table contains the overall and group means and standard deviations for each dependent variable in turn. It seems that manic psychotics and Sussex lecturers do pretty similar amounts of chicken impersonations (lecturers do slightly less actually but they are of a higher quality).

| Descriptive Statistics | | | | | | |
|------------------------|------------------|---------|----------------|----|--|--|
| | GROUP | Mean | Std. Deviation | N | | |
| QUALITY | Manic Psychosis | 6.7000 | 1.05935 | 10 | | |
| | Sussex Lecturers | 7.6000 | 2.98887 | 10 | | |
| | Total | 7.1500 | 2.23077 | 20 | | |
| QUANTITY | Manic Psychosis | 12.1000 | 4.22821 | 10 | | |
| | Sussex Lecturers | 10.7000 | 4.37290 | 10 | | |
| | Total | 11.4000 | 4.24760 | 20 | | |

The next output shows Box's test of the assumption of equality of covariance matrices. This statistic tests the null hypothesis that the variance-covariance matrices are the same in all three groups. Therefore, if the matrices are equal (and therefore the assumption of homogeneity is met) this statistic should be *non-significant*. For these data p = 0.000 (which is less than 0.05): hence, the covariance matrices are not equal and the assumption is broken. However, because group sizes are equal we can ignore this test because Pillai's trace should be robust to this violation (fingers crossed!).

 Box's Test of Equality of Covariance Matriceš

 Box's M
 20.926

 F
 6.135

 df1
 3

 df2
 58320.000

 Sig.
 .000

 Tests the null hypothesis that the observed covariance matrices of the dependent variables are equal across groups.

 a. Design: Intercept+GROUP

MANOVA Test Statistics

The next table shows the main table of results. For our purposes, the group effects are of interest because they tell us whether or not the manic psychotics and Sussex lecturers differ

along the two dimensions of quality and quantity of chicken impersonations. The column of real interest is the one containing the significance values of these *F*-ratios. For these data, all test statistics are significant with p = 0.032 (which is less than 0.05). From this result we should probably conclude that the groups do indeed differ in terms of the quality and quantity of their chicken impersonations, however, this effect needs to be broken down to find out exactly what's going on.

| Effect | | Value | F | Hypothesis df | Error df | Sig. | |
|-----------|--------------------|--------|---------------------|---------------|----------|------|--|
| Intercept | Pillai's Trace | .919 | 96.201 ^a | 2.000 | 17.000 | .000 | |
| | Wilks' Lambda | .081 | 96.201 ^a | 2.000 | 17.000 | .000 | |
| | Hotelling's Trace | 11.318 | 96.201 ^a | 2.000 | 17.000 | .000 | |
| | Roy's Largest Root | 11.318 | 96.201 ^a | 2.000 | 17.000 | .000 | |
| GROUP | Pillai's Trace | .333 | 4.250 ^a | 2.000 | 17.000 | .032 | |
| | Wilks' Lambda | .667 | 4.250 ^a | 2.000 | 17.000 | .032 | |
| | Hotelling's Trace | .500 | 4.250 ^a | 2.000 | 17.000 | .032 | |
| | Roy's Largest Root | .500 | 4.250 ^a | 2.000 | 17.000 | .032 | |

Multivariate Tests^b

a. Exact statistic

b. Design: Intercept+GROUP

Univariate Test Statistics

The next table shows a summary table of Levene's test of equality of variances for each of the dependent variables. These tests are the same as would be found if a one-way ANOVA had been conducted on each dependent variable in turn. Levene's test should be non-significant for all dependent variables if the assumption of homogeneity of variance has been met. The results for these data clearly show that the assumption has been met for the quantity of chicken impersonations but has been broken for the quality of impersonations. This should dent our confidence in reliability of the univariate tests to follow.

| Levene's Test of Equality of Error Variances | | | | | | | |
|--|--------|-----|-----|------|--|--|--|
| | F | df1 | df2 | Sig. | | | |
| QUALITY | 11.135 | 1 | 18 | .004 | | | |
| QUANTITY | .256 | 1 | 18 | .619 | | | |

Tests the null hypothesis that the error variance of the dependent variable is equal across groups. a. Design: Intercept+GROUP

The next part of the output contains the ANOVA summary table for the dependent variables. The row of interest is that labelled *GROUP* (you'll notice that the values in this row are the same as for the row labelled *Corrected Model*: this is because the model fitted to the data contains only one independent variable: **group**). The row labelled *GROUP* contains an ANOVA summary table for quality and quantity of chicken impersonations respectively. The values of p indicate that there was a non-significant difference between student groups in terms of both (both ps are greater than 0.05). The multivariate test statistics led us to conclude that the student groups *did* differ significantly across the types of psychology yet the univariate results contradict this!

| | | Type III Sum | | | | |
|-----------------|--------------------|--------------------|----|-------------|---------|------|
| Source | Dependent Variable | of Squares | df | Mean Square | F | Sig. |
| Corrected Model | QUALITY | 4.050 ^a | 1 | 4.050 | .806 | .381 |
| | QUANTITY | 9.800 ^b | 1 | 9.800 | .530 | .476 |
| Intercept | QUALITY | 1022.450 | 1 | 1022.450 | 203.360 | .000 |
| | QUANTITY | 2599.200 | 1 | 2599.200 | 140.497 | .000 |
| GROUP | QUALITY | 4.050 | 1 | 4.050 | .806 | .381 |
| | QUANTITY | 9.800 | 1 | 9.800 | .530 | .476 |
| Error | QUALITY | 90.500 | 18 | 5.028 | | |
| | QUANTITY | 333.000 | 18 | 18.500 | | |
| Total | QUALITY | 1117.000 | 20 | | | |
| | QUANTITY | 2942.000 | 20 | | | |
| Corrected Total | QUALITY | 94.550 | 19 | | | |
| | QUANTITY | 342.800 | 19 | | | |

Tests of Between-Subjects Effects

a. R Squared = .043 (Adjusted R Squared = -.010)

b. R Squared = .029 (Adjusted R Squared = -.025)

We don't need to look at contrasts because the univariate tests were nonsignificant (and in any case there were only two groups and so no further comparisons would be necessary), and instead, to see how the dependent variables interact, we need to carry out a discriminant function analysis (DFA).

| Wilks' Lambda | | | | | | |
|---------------------|------------------|------------|----|------|--|--|
| Test of Function(s) | Wilks' Lambda | Chi-square | df | Sig. | | |
| 1 | .667 | 6.893 | 2 | .032 | | |

The initial statistics from the DFA tells us that there was only one variate (because there are only two groups) and this variate is significant. Therefore, the group differences shown by the MANOVA can be explained in terms of *one* underlying dimension.

| Standardized | Canonical | Discriminant | Function | Coefficients |
|--------------|-----------|--------------|----------|--------------|
| | | | | |

| | Function |
|----------|----------|
| | 1 |
| QUALITY | 1.859 |
| QUANTITY | -1.829 |

The standardized discriminant function coefficients tell us the relative contribution of each variable to the variates. Both quality and quantity of impersonations have similar sized coefficients indicating that they have equally strong influence in discriminating the groups. However, they have the opposite sign which suggests that that group differences are explained by the difference between the quality and quantity of impersonations.

| Functions at Group Centroids | | | | | |
|---------------------------------------|-----|--|--|--|--|
| Function | | | | | |
| GROUP | 1 | | | | |
| Manic Psychosis | 671 | | | | |
| Sussex Lecturers .671 | | | | | |
| Unstandardized canonical discriminant | | | | | |

The variate centroids for each group confirms that variate 1 discriminates the two groups because the manic psychotics have a negative coefficient and the Sussex lecturers have a positive one. There won't be a combined-groups plot because there is only 1 variate.

Overall we could conclude that manic psychotics are distinguished from Sussex lecturers in terms of the difference between the pattern of results for quantity of impersonations compared to quality of them. If we look at the means we can see that Manic Psychotics produce slightly more impersonations than Sussex lecturers (but remember from the nonsignificant univariate tests that this isn't sufficient, alone, to differentiate the groups) but the lecturers produce impersonations of a higher quality (but again remember that quality alone is not enough to

differentiate the groups). Therefore, although the manic psychotics and Sussex lecturers produce similar numbers of impersonations of similar quality (see univariate tests) if we combine the quality and quantity we can differentiate the groups.

Task 2

I was interested in whether students' knowledge of different aspects of psychology improved throughout their degree. I took a sample of first years, second years and third years and gave them 5 tests (scored out of 15) representing different aspects of psychology: **Exper** (experimental psychology such as cognitive and neuropsychology etc.); **Stats** (statistics); **Social** (social Psychology); **Develop** (developmental psychology); **Person** (personality). Your task is to (1) carry out an appropriate general analysis to determine whether there are overall group differences along these 5 measures, (2) look at the scale-by-scale analyses of group differences produced in the output and interpret the results accordingly, (3) select contrasts that test the hypothesis that second and third years will score higher than first years on all scales; (4) select tests that compare all groups to each other—briefly compare these results with the contrasts; and (5) carry out a separate analysis in which you test whether a combination of the measures can successfully discriminate the groups (comment only briefly on this analysis). Include only those scales that revealed group differences for the contrasts. How do the results help you to explain the findings of your initial analysis? The data are in the file **psychology.sav**.

SPSS Output

Preliminary Analysis and Testing Assumptions

This output shows an initial table of descriptive statistics that is produced by clicking on the descriptive statistics option in the *options* dialog box. This table contains the overall and group means and standard deviations for each dependent variable in turn.

| | | 1 | | |
|-------------------------|----------|---------|-----------|----|
| | | | Std. | |
| | Gorup | Mean | Deviation | N |
| Experimental Psychology | 1st Year | 5.6364 | 2.1574 | 11 |
| | 2nd Year | 5.5000 | 1.5916 | 16 |
| | 3rd Year | 7.0000 | 2.1213 | 13 |
| | Total | 6.0250 | 2.0062 | 40 |
| Statistics | 1st Year | 7.5455 | 3.5599 | 11 |
| | 2nd Year | 8.6875 | 2.3866 | 16 |
| | 3rd Year | 10.4615 | 3.0988 | 13 |
| | Total | 8.9500 | 3.1211 | 40 |
| Social Psychology | 1st Year | 10.3636 | 2.7303 | 11 |
| | 2nd Year | 8.5625 | 2.8040 | 16 |
| | 3rd Year | 8.7692 | 1.6408 | 13 |
| | Total | 9.1250 | 2.5236 | 40 |
| Personality | 1st Year | 10.6364 | 3.3248 | 11 |
| | 2nd Year | 8.4375 | 1.9990 | 16 |
| | 3rd Year | 8.3846 | 2.3993 | 13 |
| | Total | 9.0250 | 2.6745 | 40 |
| Developmental | 1st Year | 11.0000 | 2.6458 | 11 |
| | 2nd Year | 8.8750 | 1.7078 | 16 |
| | 3rd Year | 8.7692 | 3.0319 | 13 |
| | Total | 9.4250 | 2.5908 | 40 |

Descriptive Statistics

The next output shows Box's test of the assumption of equality of covariance matrices. This statistic tests the null hypothesis that the variance-covariance matrices are the same in all three groups. Therefore, if the matrices are equal (and therefore the assumption of homogeneity is met) this statistic should be *non-significant*. For these data p = 0.06 (which is greater than 0.05): hence, the covariance matrices are roughly equal and the assumption is tenable.

Box's Test of Equality of Covariance Matrices

| Box's M | 54.241 | |
|---------|--------|--|
| F | 1.435 | |
| df1 | 30 | |
| df2 | 3587 | |
| Sig. | .059 | |
| | | |

Tests the null hypothesis that the observed covariance matrices of the dependent variables are equal across groups. a. Design: Intercept+GROUP

MANOVA Test Statistics

The next table shows the main table of results. For our purposes, the group effects are of interest because they tell us whether or not the scores from different areas of psychology differ across the three years of the degree program. The column of real interest is the one containing the significance values of these *F*-ratios. For these data, Pillai's trace (p = 0.02), Wilks's lambda (p = 0.012), Hotelling's trace (p = 0.007), and Roy's largest root (p = 0.01) all reach the criterion for significance of 0.05. From this result we should probably conclude that the profile of knowledge across different areas of psychology does indeed change across the three years of the degree. The nature of this effect is not clear from the multivariate test statistic.

| Multivariate Test s ^c | | | | | | | | |
|---|--------------------|--------|----------------------|------------|----------|------|--|--|
| | | | | Hypothesis | | | | |
| Effect | | Value | F | df | Error df | Sig. | | |
| Intercept | Pillai's Trace | .960 | 159.166 ^a | 5.000 | 33.000 | .000 | | |
| | Wilks' Lambda | .040 | 159.166 ^a | 5.000 | 33.000 | .000 | | |
| | Hotelling's Trace | 24.116 | 159.166 ^a | 5.000 | 33.000 | .000 | | |
| | Roy's Largest Root | 24.116 | 159.166 ^a | 5.000 | 33.000 | .000 | | |
| GROUP | Pillai's Trace | .510 | 2.330 | 10.000 | 68.000 | .020 | | |
| | Wilks' Lambda | .522 | 2.534 ^a | 10.000 | 66.000 | .012 | | |
| | Hotelling's Trace | .853 | 2.730 | 10.000 | 64.000 | .007 | | |
| | Roy's Largest Root | .773 | 5.255 ^b | 5.000 | 34.000 | .001 | | |

a. Exact statistic

b. The statistic is an upper bound on F that yields a lower bound on the significance level.

c. Design: Intercept+GROUP

Univariate Test Statistics

The next table shows a summary table of Levene's test of equality of variances for each of the dependent variables. These tests are the same as would be found if a one-way ANOVA had been conducted on each dependent variable in turn. Levene's test should be non-significant for all dependent variables if the assumption of homogeneity of variance has been met. The results for these data clearly show that the assumption has been met. This finding not only gives us confidence in the reliability of the univariate tests to follow, but also strengthens the case for assuming that the multivariate test statistics are robust.

| | F | df1 | df2 | Sig. |
|-------------------------|-------|-----|-----|------|
| Experimental Psychology | 1.311 | 2 | 37 | .282 |
| Statistics | .746 | 2 | 37 | .481 |
| Social Psychology | 2.852 | 2 | 37 | .071 |
| Personality | 2.440 | 2 | 37 | .101 |
| Developmental | 2.751 | 2 | 37 | .077 |

Tests the null hypothesis that the error variance of the dependent variable is equal across groups. a. Design: Intercept+GROUP

The next part of the output contains the ANOVA summary table for the dependent variables. The row of interest is that labelled *GROUP*, which contains an ANOVA summary table for each of the areas of psychology. The values of p indicate that there was a non-significant difference between student groups in terms of all areas of psychology (all ps are greater than 0.05). The

multivariate test statistics led us to conclude that the student groups *did* differ significantly across the types of psychology yet the univariate results contradict this (again .. I really should stop making up data sets that do this!)

| | | Type III | | Maan | | |
|-----------------|-------------------------|---------------------|----|----------|---------|------|
| Source | Dependent Variable | Sum or Squares | df | Square | F | Sig |
| Corrected Model | Experimental Psychology | 18.430 ^a | 2 | 9,215 | 2.461 | .099 |
| | Statistics | 52.504 ^b | 2 | 26.252 | 2.967 | .064 |
| | Social Psychology | 23.584 ^c | 2 | 11,792 | 1.941 | .158 |
| | Personality | 39.415 ^d | 2 | 19.708 | 3.044 | .060 |
| | Developmental | 37.717 ^e | 2 | 18.859 | 3.114 | .056 |
| Intercept | Experimental Psychology | 1428.058 | 1 | 1428.058 | 381.378 | .000 |
| | Statistics | 3093.775 | 1 | 3093.775 | 349.637 | .000 |
| | Social Psychology | 3330.118 | 1 | 3330.118 | 548.129 | .000 |
| | Personality | 3273.395 | 1 | 3273.395 | 505.575 | .000 |
| | Developmental | 3562.212 | 1 | 3562.212 | 588.250 | .000 |
| GROUP | Experimental Psychology | 18.430 | 2 | 9.215 | 2.461 | .099 |
| | Statistics | 52.504 | 2 | 26.252 | 2.967 | .064 |
| | Social Psychology | 23.584 | 2 | 11.792 | 1.941 | .158 |
| | Personality | 39.415 | 2 | 19.708 | 3.044 | .060 |
| | Developmental | 37.717 | 2 | 18.859 | 3.114 | .056 |
| Error | Experimental Psychology | 138.545 | 37 | 3.744 | | |
| | Statistics | 327.396 | 37 | 8.849 | | |
| | Social Psychology | 224.791 | 37 | 6.075 | | |
| | Personality | 239.560 | 37 | 6.475 | | |
| | Developmental | 224.058 | 37 | 6.056 | | |
| Total | Experimental Psychology | 1609.000 | 40 | | | |
| | Statistics | 3584.000 | 40 | | | |
| | Social Psychology | 3579.000 | 40 | | | |
| | Personality | 3537.000 | 40 | | | |
| | Developmental | 3815.000 | 40 | | | |
| Corrected Total | Experimental Psychology | 156.975 | 39 | | | |
| | Statistics | 379.900 | 39 | | | |
| | Social Psychology | 248.375 | 39 | | | |
| | Personality | 278.975 | 39 | | | |
| | Developmental | 261.775 | 39 | | | |

Tests of Between-Subjects Effects

a. R Squared = .117 (Adjusted R Squared = .070)

b. R Squared = .138 (Adjusted R Squared = .092)

C. R Squared = .095 (Adjusted R Squared = .046)

d. R Squared = .141 (Adjusted R Squared = .095)

e. R Squared = .144 (Adjusted R Squared = .098)

We don't need to look at contrasts because the univariate tests were nonsignificant, and instead, to see how the dependent variables interact, we need to carry out a discriminant function analysis (DFA).

| Wilks' Lambda | | | | |
|---------------------|------------------|------------|----|------|
| Test of Function(s) | Wilks' Lambda | Chi-square | df | Sig. |
| 1 through 2 | .522 | 22.748 | 10 | .012 |
| 2 | .926 | 2.710 | 4 | .608 |

The initial statistics from the DFA tells us that only one of the variates is significant (the second variate is non-significant, p = 0.608). Therefore, the group differences shown by the MANOVA can be explained in terms of *one* underlying dimension.

Standardized Canonical Discriminant Function Coefficients

| | Function | |
|-------------------------|----------|------|
| | 1 | 2 |
| Experimental Psychology | .367 | .789 |
| Statistics | .921 | 081 |
| Social Psychology | 353 | .319 |
| Personality | 260 | .216 |
| Developmental | 618 | .013 |

The standardized discriminant function coefficients tell us the relative contribution of each variable to the variates. Looking at the first variate it's clear that statistics has the greatest contribution to the first variate. Most interesting is that on the first variate, statistics and experimental psychology have positive weights, whereas social, developmental and personality have negative weights. This suggests that that group differences are explained by the difference between experimental psychology and statistics compared to other areas of psychology.

| Functions at Group Centroids | | | | |
|--|-----------|------|--|--|
| | Function | | | |
| Gorup | 1 | 2 | | |
| 1st Year | -1.246 | .186 | | |
| 2nd Year | 9.789E-02 | 333 | | |
| 3rd Year | .934 | .252 | | |
| Unstandardized canonical discriminant functions evaluated at group means | | | | |

The variate centroids for each group tells us that variate 1 discriminates the first years from second and third years because the first years have a negative value whereas the second and third years have positive values on the first variate.

The relationship between the variates and the groups is best illuminated using a combinedgroups plot. This graph plots the variate scores for each person, grouped according to the year of their degree. In addition, the group centroids are indicated which are the average variate scores for each group. The plot for these data confirms that variate 1 discriminates the first years from subsequent years (look at the horizontal distance between these centroids).



Overall we could conclude that different years are discriminated by different areas of psychology. In particular it seems as though statistics and aspects of experimentation (compared to other areas of psychology) discriminate between first year undergraduates and subsequent years. From the means, we could interpret this as first years struggling with statistics and experimental psychology (compared to other areas of psychology) but this ability improves across the three years. However, for other areas of psychology, first years are

relatively good but their abilities decline over the three years. Put another way, psychology degrees improve only your knowledge of statistics and experimentation.