

1. (From exam 2, Fall, 2005) An experiment measures “Ortho-P” reduction after running material through a centrifuge and adding either lime only (L) or an experimental flocculant only (F), or both (LF) or neither (C). $N = 12$ total samples are randomized to the four treatment combinations and run through the centrifuge. (Data are available as “centrifuge.dat”.)

- (a) Obtain the sum of squares for treatments (based on 3 df).

Let i, j index treatment combination and sample, respectively.

$$\begin{aligned} SS(Trt) &= \sum_i \sum_j (\bar{y}_{i+} - \bar{y}_{++})^2 \\ &= 3[(59 - 63)^2 + (61 - 63)^2 + (50 - 63)^2 + (82 - 63)^2] = 1650 \end{aligned}$$

- (b) Obtain sums of squares for three single degree-of-freedom contrasts to quantify

- interaction between lime and flocculant ($SS(l * f)$)

$$\begin{aligned} \hat{\theta}_{l*f} &= (82 - 61) - (50 - 59) = 30 \\ SS(\hat{\theta}_{l*f}) &= \frac{30^2}{4/3} = 675 \end{aligned}$$

- main effect of lime $SS(l)$

$$\begin{aligned} \hat{\theta}_{lime} &= \frac{1}{2}(50 + 82) - \frac{1}{2}(59 + 61) = 6 \\ SS(\hat{\theta}_{lime}) &= \frac{6^2}{1/3} = 108 \end{aligned}$$

- main effect of flocculant $SS(f)$.

$$\begin{aligned} \hat{\theta}_{floc} &= \frac{1}{2}(61 + 82) - \frac{1}{2}(59 + 50) = 17 \\ SS(\hat{\theta}_{floc}) &= \frac{17^2}{1/3} = 867 \end{aligned}$$

A check: $SS[Trt] = 1650 = 675 + 108 + 867$

- (c) Does adding lime improve Ortho-P reduction? Obtain 95% confidence intervals for the simple lime effects in the absence or presence of the flocculant.

$$\begin{aligned} \hat{\mu}[\text{lime no flocculant}] &= 50 - 59 = -9 \\ SE(\hat{\mu}[\text{lime no flocculant}]) &= \sqrt{MSE(2/3)} = 5.2 \end{aligned}$$

95% confidence interval: $-9 \pm 2.31(5.2)$ or -9 ± 12

$$\begin{aligned} \hat{\mu}[\text{lime with flocculant}] &= 82 - 61 = 21 \\ SE(\hat{\mu}[\text{lime with flocculant}]) &= \sqrt{MSE(2/3)} = 5.2 \end{aligned}$$

95% confidence interval: $21 \pm 2.31(5.2)$ or 21 ± 12

- (d) Obtain an interaction plot to convey the effects of the treatments on Ortho-P reduction.

2. Rao 13.10

(a)

$$F = \frac{MS(Trt)}{MS(E)} = \frac{493}{0.35} = 1407 (df = 3, 12, p < .0001)$$

Conclude that the sample treatment means, $\bar{y}_{11} = 10.3$, $\bar{y}_{12} = 19.6$, $\bar{y}_{21} = 10.7$, $\bar{y}_{22} = 34$ differ significantly.

- (b) $\hat{m}u[AB] = \bar{y}_{12} - \bar{y}_{11} - (\bar{y}_{22} - \bar{y}_{21}) = 14.1$ (also ok to divide this difference of slopes by two, the p -value for a test of additivity is the same)
 (c) $t = 27.7$ on $df = 12$, highly significant.

3. Rao 13.14 Well, one example of how it can be misleading to talk about main effects is if you're talking about the differences among the varieties; there are none if when pretreatment 3 is used, but averaging over pretreatments suggests a variety effect.

4. Rao 13.23

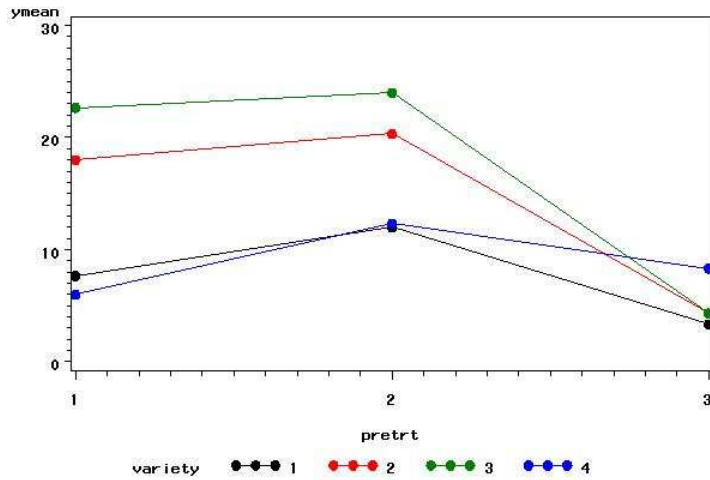
(a)

The SAS System					
The GLM Procedure					
Class Level Information					
Class	Levels	Values			
pretprt	3	1	2	3	
variety	4	1	2	3	4

Source	DF	Sum of Squares	Mean Square	F Value	Pr > F
Model	11	1872.555556	170.232323	8.52	<.0001
Error	24	479.333333	19.972222		
Corrected Total	35	2351.888889			

- (b) Looks like interaction, with pretreatment effects that are most pronounced for varieties 2 and 3. (Pretreatment 3 is not so great, particularly for these two varieties.)

Interaction plot for 13.23



(c) ANOVA table:

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The SAS System
The GLM Procedure
Class Level Information
Class      Levels  Values
pretreatment 3      1 2 3
variety      4      1 2 3 4
    
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1

Source	DF	Sum of Squares	Mean Square	F Value	Pr > F
Model	11	1872.555556	170.232323	8.52	<.0001
Error	24	479.333333	19.972222		
Corrected Total	35	2351.888889			

Source	DF	Type III SS	Mean Square	F Value	Pr > F
pretreatment	2	924.388889	462.194444	23.14	<.0001
variety	3	525.444444	175.148148	8.77	0.0004
pretreatment*variety	6	422.722222	70.453703	3.53	0.0120

The interaction is significant. Inspection of the plot indicates that there are significant variety effects, but only when using pretreatments 2 and 3. For pretreatments 1 and 2, it looks like varieties 2 and 3 yield longer root lengths, on average. I tested for pretreatment effects separately for each variety:

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The GLM Procedure
Least Squares Means
    
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pretreatment*variety Effect Sliced by variety for y

variety	DF	Sum of Squares	Mean Square	F Value	Pr > F
1	2	112.666667	56.333333	2.82	0.0794
2	2	448.222222	224.111111	11.22	0.0004
3	2	724.666667	362.333333	18.14	<.0001
4	2	61.555556	30.777778	1.54	0.2346

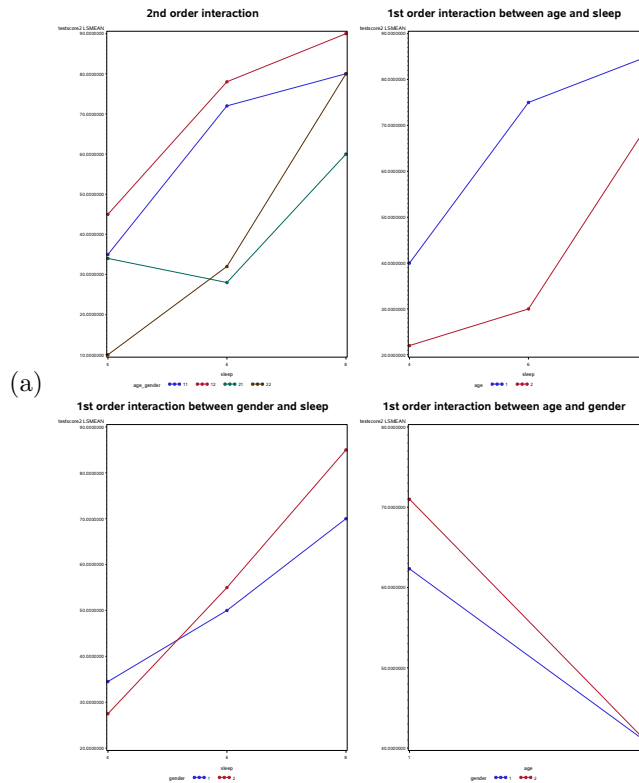
Since the effects were only significant for varieties 2 and 3, I carried out pairwise comparisons for within these two varieties. If a Scheffe adjustment is used, the only differences that are significant are those involving pretreatment 3 and variety 3, which yields significantly lower root lengths than pretreatments 1 or 2:

V2: V1 - V3

V3: V2 - V3

(Assignment is extended here, updating previous version of HW4, which was shorter.)

5. Consider the data from exercise 13.31 (p. 632). (See the code entitled “sleep.sas”). Note that while the means for all $t = abc = 12$ treatment combinations are given, the triplicate ($n = 3$) observations are not. The error mean square from the full ANOVA is $MS(E) = 143$ on $df = 24$.



- (b) Without taking into account the sampling variability, it may not be wise to make assessments of interaction (or any) effects from plots alone. (See part (c).)

(c) The GLM Procedure

Class	Levels	Values
age	2	1 2
gender	2	1 2
sleep	3	4 6 8

Source	DF	Sum of Squares	Mean Square	F Value	Pr > F
Model	11	22562.00000	2051.09091	14.34	<.0001
Error	24	3432.00000	143.00000		
Corrected Total	35	25994.00000			

R-Square	Coeff Var	Root MSE	testscore2 Mean
0.867970	22.28247	11.95826	53.66667

Source	DF	Type III SS	Mean Square	F Value	Pr > F
age	1	6084.00000	6084.00000	42.55	<.0001
gender	1	169.00000	169.00000	1.18	0.2878
age*gender	1	169.00000	169.00000	1.18	0.2878
sleep	2	12998.00000	6499.00000	45.45	<.0001
age*sleep	2	1638.00000	819.00000	5.73	0.0093
gender*sleep	2	728.00000	364.00000	2.55	0.0994
age*gender*sleep	2	776.00000	388.00000	2.71	0.0866

At level $\alpha = .05$, the only interaction effect for which there is enough evidence in the experiment to reject the null hypothesis of no population interaction effect in the population is the first-order interaction between age and sleep ($p = .0093$, $df = 2, 24$). There is no evidence of any effects due to gender. I won't look at the main effect of sleep, as the effect of sleep appears to depend on age.

- (d) No conclusions were made in part (b)
- (e) For young folks, the mean test score at sleep=4 is significantly lower than at sleep=6 or sleep=8.
For older folks, the mean test score at sleep=8 is significantly higher than at sleep=4 or sleep=6.

Obs	Effect	age	sleep	_age	_sleep	Estimate	StdErr	DF	tValue	Probt	Adjustment	Adj p
1	age*sleep	1	4	1	6	-35.0000	6.9041	24	-5.07	<.0001	Tukey	0.0004
2	age*sleep	1	4	1	8	-45.0000	6.9041	24	-6.52	<.0001	Tukey	<.0001
6	age*sleep	1	6	1	8	-10.0000	6.9041	24	-1.45	0.1604	Tukey	0.6984
13	age*sleep	2	4	2	6	-8.0000	6.9041	24	-1.16	0.2580	Tukey	0.8515
14	age*sleep	2	4	2	8	-48.0000	6.9041	24	-6.95	<.0001	Tukey	<.0001
15	age*sleep	2	6	2	8	-40.0000	6.9041	24	-5.79	<.0001	Tukey	<.0001

- (f) It is ok to use Tukey's procedure for post-hoc comparisons.
- (g) Estimate the two orthogonal polynomial contrasts for the effect of sleep deprivation on young folks: linear (θ_1) and quadratic (θ_2). (Average over gender.) Report the sums of squares for these two contrasts.

$$\begin{aligned}\hat{\theta}_1 &= -1\bar{y}_{1+1+} + \quad \quad \quad + 1\bar{y}_{1+3+} = 45 \\ \hat{\theta}_2 &= 1\bar{y}_{1+1+} + (-2)\bar{y}_{1+2+} + 1\bar{y}_{1+3+} = -25\end{aligned}$$

$$\begin{aligned}SS(\theta_1) &= \frac{45^2}{2/6} = 6075 \\ SS(\theta_2) &= \frac{(-25)^2}{6/6} = 625\end{aligned}$$

- (h) Repeat part g for older folks (to obtain contrasts θ_3 and θ_4 and their sums of squares.)

$$\begin{aligned}\hat{\theta}_3 &= -1\bar{y}_{2+1+} + \quad \quad \quad + 1\bar{y}_{2+3+} = 48 \\ \hat{\theta}_4 &= 1\bar{y}_{2+1+} + (-2)\bar{y}_{2+2+} + 1\bar{y}_{2+3+} = 32\end{aligned}$$

$$\begin{aligned}SS(\theta_3) &= \frac{48^2}{2/6} = 6912 \\ SS(\theta_4) &= \frac{32^2}{6/6} = 1024\end{aligned}$$

- (i) Consider two more contrasts, the linear sleep-by-age interaction, $\theta_5 = \theta_1 - \theta_3$ and the quadratic sleep-by-age interaction, $\theta_6 = \theta_2 - \theta_4$. Report sums of squares. Note that θ_5 and θ_6 are orthogonal and $SS(\theta_5) + SS(\theta_6) = SS(\text{age} \times \text{sleep})$.

$$\begin{aligned}\hat{\theta}_5 &= \hat{\theta}_1 - \hat{\theta}_3 = -3 \\ \hat{\theta}_6 &= \hat{\theta}_1 - \hat{\theta}_3 = 57 \\ SS(\theta_5) &= \frac{(-3)^2}{4/6} = 13.5 \\ SS(\theta_6) &= \frac{57^2}{12/6} = 1624.5 \\ \text{sum} &= 1638\end{aligned}$$

6. Consider the unbalanced version of the cholesterol data for the four age-gender cohorts discussed in the notes. Report the contrast vectors of the form $(c_{11}, c_{12}, c_{21}, c_{22})$ needed to obtain the least squares estimates of the marginal means for men, for women and for the four combinations of age and gender. Report the estimates based on the data (fill in the table given on 149 of the lecture packet.)

The LSMEAN for men is the linear combination of the sample treatment means ($\hat{\theta} = \sum_i \sum_j \bar{y}_{ij+}$ with expectation $\mu + \frac{1}{2}(\alpha_1 + \alpha_2) + \beta_1$. To have this expectation, the coefficients must satisfy

$$\begin{aligned}c_{11} + c_{12} &= \frac{1}{2} \\ c_{11} + c_{21} &= 1 \\ c_{21} + c_{22} &= \frac{1}{2}\end{aligned}$$

the variance of any linear combination of treatment means is proportional to

$$\frac{c_{11}^2}{n_{11}} + \frac{c_{12}^2}{n_{12}} + \frac{c_{21}^2}{n_{21}} + \frac{c_{22}^2}{n_{22}}$$

and in this case, as a function of c_{11} it looks like

$$\frac{c_{11}^2}{6} + \frac{(\frac{1}{2} - c_{11})^2}{1} + \frac{(1 - c_{11})^2}{21} + \frac{(c_{11} - 1)^2}{7}$$

This may be minimized by setting the derivative wrt c_{11} equal to 0:

$$\frac{c_{11}}{3} - 2(\frac{1}{2} - c_{11}) - 2(1 - c_{11}) + \frac{2(c_{11} - \frac{1}{2})}{7} = 0$$

which has solution $c_{11} = 66/97$ and the LSMEAN is

$$(66/97, 1/2 - 66/97, 1 - 66/97, 66/97 - 1/2)(220.7, 162, 289, 212)' = 251.5$$

. Similarly for women, a contrast with expectation $\mu + \frac{1}{2}(\alpha_1 + \alpha_2) + \beta_2$ which has minimum variance at $c_{11} = 18/97$ yielding the linear combination

$$(18/97, 1/2 - 18/97, -18/97, 18/97 + 1/2)(220.7, 162, 289, 212)' = 183.6$$

For the treatment combinations, the coefficient solutions are given in the table below:

Population group	effect	solution for c_{11}	LSMEAN
young men	$\mu + \alpha_1 + \beta_1$	90/97	221.99
young women	$\mu + \alpha_1 + \beta_2$	42/97	154.1
older men	$\mu + \alpha_2 + \beta_1$	42/97	281.1
older women	$\mu + \alpha_2 + \beta_2$	-6/97	213.1