

AA

**Common Information for Questions 1 and 2**

A research team sought to estimate the model  $E(Y) = \beta_0 + \beta_1 x + \beta_2 w$ . The variable  $Y$  was the measure of the task proficiency of an employee observed 2 years after initial training; the variable  $w$  was the measure of the employee's achievement level with supplemental training given 1 year after initial training; and the variable  $x$  was the measure of the task proficiency of the employee observed immediately after training. They observed values of  $y$ ,  $x$ ,  $w$  on  $n = 312$  employees. They found that the standard deviation of  $x$ , where the variance estimator used division by  $n - 1$  was 55.6; the standard deviation of  $w$  was 33.1; and the standard deviation of  $Y$  was 41.7. The correlation between  $Y$  and  $x$  was 0.58; the correlation between  $Y$  and  $w$  was 0.69; and the correlation between  $x$  and  $w$  was 0.82. (Total 100 points)

1. Compute the partial correlation coefficient  $r_{Yx \cdot w}$  and the partial correlation coefficient  $r_{Yw \cdot x}$ . Is a mediation model or an explanation model a better explanation of the observed results? (50 points)
2. Compute the analysis of variance table for the multiple regression analysis of  $Y$ . Include the sum of squares due to the regression on  $x$ , the sum of squares due to the regression on  $w$  after including  $x$ , the sum of squared errors, the total sum of squares, and each degree of freedom. What is your decision for the test of the null hypothesis that  $\beta_2 = 0$ ? Use levels of significance 0.10, 0.05, and 0.01. (50 points)

*End of application of common information*

$$1A. \quad r_{Yx \cdot w} = \frac{r_{Yx} - r_{Yw} r_{xw}}{\sqrt{(1 - r_{Yw}^2)(1 - r_{xw}^2)}} = \frac{0.58 - (0.69)(0.82)}{\sqrt{(1 - .69^2)(1 - .82^2)}}$$

$$= \frac{0.0142}{\sqrt{.5239}(.3276)} = \frac{0.0142}{\sqrt{.17163}} = 0.03427$$

$$r_{Yw \cdot x} = \frac{0.69 - (0.58)(0.82)}{\sqrt{(1 - .58^2)(1 - .82^2)}} = \frac{0.2144}{\sqrt{.436}(.3276)}$$

$$= \frac{0.2144}{\sqrt{.21740}} = 0.45983$$

SINCE  $se(r_{Yx \cdot w}) \approx \frac{1}{\sqrt{n-3}} = 0.057$ ,  $r_{Yx \cdot w} \approx 0$ . KEY VARIABLE IS  $w$



MEDIATION MODEL. DESCRIBES THIS DATA.

# AMS 315 F2020 EXAMINATION 3 SOLUTION

$$2A. TSS = (n-1)(SD_{DV})^2 = 311(41.7)^2 = 540,794.79.$$

$$SS_{REG(x)} = (.58)^2 TSS = 181,923.37$$

$$TSS - SS_{REG(x)} = 358,871.42$$

$$SS_{REG(w|x)} = (r_{yw \cdot x})^2 (TSS - SS_{REG(x)})$$

$$= (0.45983)^2 (358,871.42)$$

$$= 75,881.08$$

$$SSE = TSS - SS_{REG(x)} - SS_{REG(w|x)}$$

$$= 282,990.34.$$

| ANOVA TABLE |     |            |           |
|-------------|-----|------------|-----------|
| SOURCE      | DF  | SS         | MS        |
| REG(x)      | 1   | 181,923.37 |           |
| REG(w x)    | 1   | 75,881.08  | 75,881.08 |
| ERROR       | 309 | 282,990.34 | 915.83    |
| TOTAL       | 311 | 540,794.79 |           |

$$F_{w|x} = \frac{MS_{REG(w|x)}}{MSE} = \frac{75,881.08}{915.83} = 82.86.$$

| $\alpha$ | $F(1, 309)$ | $F(1, \infty)$ |        |
|----------|-------------|----------------|--------|
| .10      | 2.722       | 2.71           | REJECT |
| .05      | 3.872       | 3.84           | REJECT |
| .01      | 6.718       | 6.64           | REJECT |

REJECT  $H_0: \beta_2 = 0$  VS  $H_1: \beta_2 \neq 0$  AT  $\alpha = .01$  (AND .05 AND .10).

### Common Information for Questions 1 and 2

A research team sought to estimate the model  $E(Y) = \beta_0 + \beta_1 x + \beta_2 w$ , using data from  $n = 471$  participants. The variable  $Y$  was the measure of the participant's criminality at age 20 (a higher number reflecting more criminal behavior); the variable  $w$  was the participant's education attainment at age 18 (higher number reflecting more attainment); and the variable  $x$  was the participant's delinquency at age 15 (higher number reflecting more delinquency). They found that the standard deviation of  $Y$ , where the variance estimator used division by  $n - 1$ , was 34.9; the standard deviation of  $x$  was 15.7; and the standard deviation of  $w$  was 41.6. The correlation between  $Y$  and  $w$  was -0.21; the correlation between  $Y$  and  $x$  was 0.61; and the correlation between  $x$  and  $w$  was -0.32.

1. Compute the partial correlation coefficient  $r_{Yx \cdot w}$  and the partial correlation coefficient  $r_{Yw \cdot x}$ . Is a mediation model or an explanation model a better explanation of the observed results? (50 points)
2. Compute the analysis of variance table for the multiple regression analysis of  $Y$ . Include the sum of squares due to the regression on  $x$ , the sum of squares due to the regression on  $w$  after including  $x$ , the sum of squared errors, the total sum of squares, and each degree of freedom. What is your decision for the test of the null hypothesis that  $\beta_2 = 0$ ? Use levels of significance 0.10, 0.05, and 0.01. (50 points)

### *End of application of common information*

$$1B. \quad r_{yx.w} = \frac{r_{yx} - r_{yw} r_{xw}}{\sqrt{(1 - r_{yw}^2)(1 - r_{xw}^2)}} = \frac{0.61 - (-0.21)(-0.32)}{\sqrt{(1 - (-0.21)^2)(1 - (-0.32)^2)}}$$

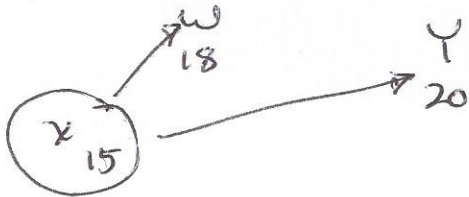
$$= \frac{.5428}{\sqrt{(.9559)(.8976)}} = \frac{.5428}{\sqrt{.85802}} = .58600$$

$$r_{Yw \cdot x} = \frac{-0.21 - (0.61)(-0.32)}{\sqrt{(1 - .61^2)(1 - (-.32)^2)}} = \frac{-0.0148}{\sqrt{(.6279)(.8976)}}$$

$$= \frac{-0.0148}{\sqrt{.56360}} = \frac{-0.0148}{0.75073} = -0.01971$$

Since  $se(r_{Yw.X}) \approx \frac{1}{\sqrt{468}} = .046$ ,  $r_{Yw.X} \approx 0$ , AND

$x$  IS THE KEY VARIABLE.



THIS IS AN  
EXPLANATION  
MODEL.



$$2B. TSS = (n-1) SD_y^2 = 470 (34.9)^2 = 572,464.7$$

$$SSREG(x) = R_{yx}^2 TSS = (.61)^2 TSS = 213,014.1$$

$$TSS - SSREG(x) = 359,450.6$$

$$SSREG(w|x) = R_{y|w,x}^2 (TSS - SSREG(x))$$

$$= (-0.01971)^2 (TSS - SSREG(x))$$

$$= 139.6$$

$$SSERR = TSS - SSREG(x) - SSREG(w|x)$$

$$= 359,311.0$$

## ANOVA TABLE

| SOURCE   | DF  | SS        | MS    |
|----------|-----|-----------|-------|
| REG (x)  | 1   | 213,014.1 |       |
| REG(w x) | 1   | 139.6     | 139.6 |
| ERROR    | 468 | 359,311.0 | 767.8 |
| TOTAL    | 470 | 572,464.7 |       |

$$F_{w|x} = \frac{139.6}{767.8} = 0.18$$

|          |             |        |
|----------|-------------|--------|
| $\alpha$ | $F(1, 468)$ |        |
| .10      | 2.716       | ACCEPT |
| .05      | 3.861       | ACCEPT |
| .01      | 6.689       | ACCEPT |

ACCEPT  $H_0: \beta_2 = 0$  vs  $H_1: \beta_2 \neq 0$  AT  $\alpha = .10$  (AND  $\alpha = .05$  AND  $\alpha = .01$ ), EDUCATIONAL ATTAINMENT

AT AGE 18 IS NOT ASSOCIATED WITH CRIMINALITY

AT AGE 20 AFTER CONTROLLING FOR DELINQUENCY

AT AGE 15.



3C CONTINUED

ACCEPT  $H_0$ : ALL FOUR DOSE MEANS ARE EQUAL  
 VS  $H_1$ : AT LEAST TWO DOSES HAVE DIFFERENT  
 MEANS AT  $\alpha = .10$  (AND  $\alpha = .05$  AND  $\alpha = .01$ ).

$$4C \quad \hat{\lambda}_{\text{LINEAR}} = -3(57.2) - 82.4 + 41.6 + 3(62.8) \\ = -24.$$

$$SS_{\text{LINEAR}} = \frac{(-24)^2}{[(-3)^2 + (-1)^2 + (1)^2 + 3^2] / 10} = 288$$

99% SCHEFFE CI FOR  $\lambda_2$  IS.

$$-24 \pm \sqrt{3(4.377)} \sqrt{2593 \left( \frac{20}{10} \right)}$$

$$-24 \pm (3.624)(72.0)$$

$$-24 \pm 260.98$$

$$= -284.98 \text{ TO } 236.98.$$

THERE IS NO OPTIMAL SETTING!  
 ALL DOSES APPEAR EQUAL.



### Common Information for Questions 3 and 4

3. Complete the analysis of variance table for these results; that is, be sure to specify the degrees of freedom, sums of squares, mean squares, F-test, and your conclusion. Test the null hypothesis that all treatment means are equal using significance levels 0.10, 0.05, and 0.01. This question is worth 40 points.
4. Find the estimated quadratic contrast, the sum of squares due to the quadratic contrast and the 99% Scheffe confidence interval for the quadratic contrast. The coefficients of the quadratic contrast are 1, -1, -1, 1. What is the optimal setting of dosage, and how do you document it? This question is worth 40 points.

| ANOVA TABLE  |           |                  |          |      |
|--------------|-----------|------------------|----------|------|
| SOURCE       | DF        | SS               | MS       | F    |
| TREATMENT    | 3         | 42,604.8         | 14,201.6 | 6.84 |
| (PURE) ERROR | 60        | 124,590.0        | 2,076.5  |      |
| <u>TOTAL</u> | <u>63</u> | <u>167,194.8</u> |          |      |

# AMS 315 F2020 EXAMINATION 3 SOLUTION.

| $\alpha$ | $F(3, 60)$ | DECISION | REJECT $H_0$ : ALL DOSE MEANS EQUAL VS $H_1$ : AT LEAST TWO DOSE MEANS ARE DIFFERENT |
|----------|------------|----------|--|
| .10      | 2.177      | REJECT   | AT $\alpha = .01$ (AND $\alpha = .05$ AND $\alpha = .10$ ).                          |
| .05      | 2.758      | REJECT   |  |
| .01      | 4.126      | REJECT   |  |

4.D  $\lambda_{\text{QUADRATIC}} = 1(132.8) - 97.4 - 61.6 + 84.2 = 58.0$

$$SS_{\text{QUADRATIC}} = \frac{(\lambda_{\text{QUADRATIC}})^2}{[1^2 + (-1)^2 + (-1)^2 + 1^2] / 16} = 13,456$$

99% SCHEFFE CI FOR  $\lambda_{\text{QUADRATIC}}$  IS

$$58.0 \pm \sqrt{3(4.126)} \sqrt{2076.5 \left( \frac{4}{16} \right)}$$

$$58.0 \pm (3.518) (22.78)$$

$$58.0 \pm 80.15 = -22.15 \text{ TO } 138.15$$

CI INCLUDES 0.

DOSE WITH LOWEST AVERAGE IS DOSE 2.

99% LSD IS  $t_{2.576, 60} \sqrt{MSE \left( \frac{3}{5} \right)}$

$$= (2.660) \sqrt{2076.5 \left( \frac{3}{16} \right)}$$

$$= (2.660) (16.11) = 42.86$$

NOTE  $61.6 + (99\% \text{ LSD}) = 104.46$

ONLY DOSE 0 APPEARS DIFFERENT FROM DOSE 2.

DOSES 1, 2, AND 3 HAVE NEARLY EQUAL MEANS BY LSD.



**Common Information for Questions 5 and 6**

5. Complete the analysis of variance table for the linear regression of the dependent variable on the dosage level by using the sum of squares for the linear contrast as the regression sum of squares. Test the null hypothesis that the average response is not linearly associated with the dosage given. Use the 0.10, 0.05, and 0.01 levels of significance.
6. Test the null hypothesis that the linear model is adequate at the 0.10, 0.05, and 0.01 levels. Report the analysis of variance table that includes the sum of squares for lack of fit of the linear regression and the sum of squares due to pure error. What is your recommendation for the optimum setting of the dosage?

$$5E \quad SS \text{ LINEAR} = \frac{(\hat{\lambda}_{\text{LINEAR}})^2}{[(-3)^2 + (-1)^2 + 1^2 + 3^2] / 35}$$

$$= \frac{(572)^2}{20/35} = 572,572 \text{ on 10F}$$

| SOURCE       | DF         | SS               | MS        | F     |
|--------------|------------|------------------|-----------|-------|
| LINEAR       | 1          | 572,572          | 572,572   | 18.45 |
| ERROR        | 138        | 4,281,720        | 31,026.96 |       |
| <u>TOTAL</u> | <u>139</u> | <u>4,854,292</u> |           |       |

4,854,292 - 572,572

$$SSE = SS_{TOTAL} - SS_{LINEAR} = 4,854,292 - 572,572 = 4,281,720$$

$$F_{\text{LINEAR}} = \frac{MS_{\text{REG}}}{MSE} = \frac{572,572}{31,026.96} = 18.45$$

$\alpha$        $F(1, 138)$   
 .10      2.742 REJECT  
 .05      3.910 REJECT  
 .01      6.822 REJECT

31,026.96

REJECT  $H_0$ : NO LINEAR ASSOCIATION  
VS  $H_1$ : LINEAR ASSOCIATION  
AT  $\alpha = .01$  (AND  $\alpha = .05$  AND  $\alpha = .05$ ).

# AMS 315 F2020 EXAMINATION 3 SOLUTION.

$$GE: SS_{LOF} = SS_{QUAD} + SS_{CUB}$$

$$SS_{QUAD} = \frac{(\hat{\lambda}_{QUAD})^2}{[(-1)^2 + (-1)^2 + (-1)^2 + 1^2]/35} = \frac{(-36)^2}{4/35} = 11,340$$

$$SS_{CUBIC} = \frac{(\hat{\lambda}_{CUBIC})^2}{[(-1)^2 + (3)^2 + (-3)^2 + 1^2]/35}$$

$$= \frac{(-216)^2}{20/35} = 81,648$$

$$SS_{LOF} = 11,340 + 81,648 = 92,988 \text{ ON 2 DF}$$

$$MS_{LOF} = SS_{LOF}/2 = 46,494$$

$$MS_{PE} = \frac{S_1^2 + S_2^2 + S_3^2 + S_4^2}{4} = \frac{35,040 + 26,492 + 36,820 + 24,846}{4}$$

$$= \frac{123,198}{4} = 30,799.5 \text{ ON 136 DF}$$

$$SS_{PE} = 136(MS_{PE}) = 4,188,732$$

ANOVA TABLE LACK OF FIT.

| SOURCE      | DF  | SS        | MS       |
|-------------|-----|-----------|----------|
| LINEAR      | 1   | 572,572   | 572,572  |
| LACK OF FIT | 2   | 92,988    | 46,494   |
| PURE ERROR  | 136 | 4,188,732 | 30,799.5 |
| TOTAL       | 139 | 4,854,292 |          |

$$F_{LOF} = \frac{MS_{LOF}}{MS_{PE}} = \frac{46,494}{30,799.5} = 1.51 \text{ ON (2, 136) DF.}$$

$\alpha$   $F(2, 136)$

.10 2.342 ACCEPT

.05 3.063 ACCEPT

.01 4.765 ACCEPT

ACCEPT  $H_0$  LINEAR MODEL ADEQUATE AT  $\alpha = .10$

(AND  $\alpha = .05$  AND  $.01$ ).

DOSAGE 1 HAS SMALLEST MEAN: POSITIVE SLOPE

SUGGESTS DOSAGE OF THIS MEDICINE DOES NOT HELP.

99% LSD = 109.6 DOSE 1 HAS LOWER MEAN THAN DOSE 3 OR DOSE 4.



FF

### Common Information for Questions 5 and 6

A research team randomly assigned animals to four settings of a dosage of an experimental medicine and observed the response  $Y$ . The research team sought to find the dosage that maximized the response variable. Twenty eight animals were given one unit of dosage with observed average and sample variance (unbiased estimate)  $y_1 = 220$  and  $s_1^2 = 44,912$ ; 28 were given two units of dosage with  $y_2 = 196$  and  $s_2^2 = 51,016$ ; 28 were given three units of dosage with  $y_3 = 280$  and  $s_3^2 = 55,384$ ; and 28 were given four units of dosage with  $y_4 = 444$  and  $s_4^2 = 23,408$ . The total sum of squares is 5,766,096. With regard to the orthogonal polynomials, the estimated linear contrast is 756, and its coefficients are  $-3, -1, 1, 3$ . The estimated quadratic contrast is 188, and its coefficients are  $1, -1, -1, 1$ . The estimated cubic contrast is  $-28$ , and its coefficients are  $-1, 3, -3, 1$ .

5. Complete the analysis of variance table for the linear regression of the dependent variable on the dosage level by using the sum of squares for the linear contrast as the regression sum of squares. Test the null hypothesis that the average response is not linearly associated with the dosage given. Use the 0.10, 0.05, and 0.01 levels of significance. (40 points)
6. Test the null hypothesis that the linear model is adequate at the 0.10, 0.05, and 0.01 levels. Report the analysis of variance table that includes the sum of squares for lack of fit of the linear regression and the sum of squares due to pure error. What is your recommendation for the optimum setting of the dosage? (50 points)

### End of Application of Common Information

$$SF: SS_{\text{LINEAR}} = \frac{(\sum \text{LINEAR})^2}{[(-3)^2 + (-1)^2 + (1)^2 + (3)^2] / 28} = \frac{(756)^2}{20/28} = 800,150.4.$$

$$SS_{\text{ERR}} = SS_{\text{TOTAL}} - SS_{\text{LINEAR}} \\ = 5,766,096 - 800,150.4 = 4,965,945.6 \text{ ON } 110 \text{ DF.}$$

ANOVA TABLE PROBLEM 5F

| SOURCE | DF  | SS          | MS        | F      |
|--------|-----|-------------|-----------|--------|
| LINEAR | 1   | 800,150.4   | 800,150.4 | 17.72. |
| ERROR  | 110 | 4,965,945.6 | 45,144.96 |        |
| TOTAL  | 111 | 5,766,096   |           |        |

| $\alpha$ | $F(1, 110)$ |        |
|----------|-------------|--------|
| .10      | 2.752       | REJECT |
| .05      | 3.927       | REJECT |
| .01      | 6.871       | REJECT |

REJECT  $H_0$ : NO LINEAR ASSOCIATION VS.  $H_1$ : LINEAR ASSOCIATION AT  $\alpha = .01$  (AND  $\alpha = .05$  AND  $\alpha = .10$ ).



# AMS 315 F 2020 EXAMINATION 3 SOLUTION.

$$MSPE = \frac{\Delta_1^2 + \Delta_2^2 + \Delta_3^2 + \Delta_4^2}{4} = \frac{44,912 + 51,016 + 55,384 + 23,408}{4}$$

6F:

$$= \frac{174,720}{4} = 43,680 \text{ ON } 108 \text{ DF}$$

$$SSPE = 4,717,440$$

$$\text{I } SS_{LOF} = TSS - SSLIN - SSPE$$

$$= 5,766,096 - 800,150.4 - 4,717,404 = 248,505.6 \text{ ON } 2 \text{ DF.}$$

$$\text{II } SS_{LOF} = SS_{QUAD} + SS_{CUB} = 247,408 + 1097.6 = 248,505.6$$

$$SS_{QUAD} = 247,408 = \frac{(188)^2}{4/28} \quad SS_{CUB} = 1097.6 = \frac{(-28)^2}{20/28}$$

ANOVA TABLE LACK OF FIT.

| SOURCE      | DF  | SS        | MS        |
|-------------|-----|-----------|-----------|
| LINEAR      | 1   | 800,150.4 | 124,252.8 |
| LACK OF FIT | 2   | 248,505.6 | 43,680.   |
| PURE ERROR  | 108 | 4,717,440 |           |
| TOTAL       | 111 | 5,766,096 |           |

$$F_{LOF} = \frac{MS_{LACK OF FIT}}{MSPE} = \frac{124,252.8}{43,680} = 2.845 \text{ ON } (2, 108) \text{ DF.}$$

$\alpha$   $F(2, 108)$

.10 2.352 REJECT

.05 3.080 ACCEPT

.01 4.807 ACCEPT

ACCEPT  $H_0$  LINEAR MODEL ADEQUATE

AT  $\alpha = .01$  AND  $\alpha = .05$ . REJECT

$H_0$  LINEAR MODEL ADEQUATE AT

$\alpha = .10$ .

DOSE 4 HAS MAXIMUM MEAN. SINCE SLOPE IS POSITIVE

LARGER DOSES MAY HAVE LARGER MEANS.

$$99\% \text{ LSD} = 146.5; 444 - 146.5 = 297.5 \text{ DOSE 4}$$

HAS GREATER MEAN THAN DOSES 1, 2, 3 USING

99% LSD.

7. Consider the usual regression model. The random vector  $Y$  is  $n \times 1$ , with  $Y = X\beta + \varepsilon$ , where  $\beta$  is a  $p \times 1$  vector of (unknown) constants,  $X$  is an  $n \times p$  matrix of known constants with  $\text{rank}(X) = p$  (so that  $(X^T X)^{-1}$  exists),  $\varepsilon$  is an  $n \times 1$  vector of random variables with  $E(\varepsilon) = 0$  and  $\text{vcv}(\varepsilon) = \sigma^2 I_{n \times n}$  where  $I_{n \times n}$  is the  $n \times n$  identity matrix. Let  $W = [I_{n \times n} - X(X^T X)^{-1} X^T]Y$ , where  $X^T$  is the transpose of  $X$ .

- ## End of the Examination

6. LET  $M = [I - X(X^T X)^{-1} X^T]$

$$\begin{aligned} \text{vcv}(W) &= \text{vcv}(MY) = M \text{vcv}(Y) M^T \\ &= [I - X(X^T X)^{-1} X^T] \sigma^2 I [I - X(X^T X)^{-1} X^T]^T \\ &= \sigma^2 [I - X(X^T X)^{-1} X^T] [I^T - (X^T)^T (X^T X)^{-1}]^T X^T \\ &= \sigma^2 [I - X(X^T X)^{-1} X^T] [I - X(X^T X)^{-1} X^T] \\ &= \sigma^2 [I \otimes I - I X(X^T X)^{-1} X^T - X(X^T X)^{-1} X^T I \\ &\quad + X(X^T X)^{-1} X^T X (X^T X)^{-1} X^T] \\ &= \sigma^2 [I - 2X(X^T X)^{-1} X^T + X(X^T X)^{-1} [X^T X (X^T X)^{-1}] X^T] \\ &= \sigma^2 [I - X(X^T X)^{-1} X^T] \end{aligned}$$