Psychology 407 Assignment C

In an experiment designed to assess a possible curvilinear relationship between level of background noise on task performance, an experimenter assigned (at random) 10 subjects to each of 6 noise levels (assumed to be equally-spaced values of 1, 2, ..., 6) and obtained a "number correct" score on a heavily speeded performance measure. The data for this study turned out as follows (the columns are labeled by Noise Level):

| one | two | three | four | five | six |
|-----|-----|-------|------|------|----------------|
| 18 | 34 | 39 | 37 | 15 | 14 |
| 24 | 36 | 41 | 32 | 18 | 19 |
| 20 | 39 | 35 | 25 | 27 | 5 |
| 26 | 43 | 48 | 28 | 28 | 25 |
| 23 | 48 | 44 | 29 | 22 | $\overline{7}$ |
| 29 | 28 | 38 | 31 | 24 | 13 |
| 27 | 30 | 42 | 34 | 21 | 10 |
| 33 | 33 | 47 | 38 | 19 | 16 |
| 32 | 37 | 53 | 43 | 13 | 20 |
| 38 | 42 | 33 | 23 | 33 | 11 |

Because of possible computational issue in fitting polynomial models (question: what are they?), the 6 noise levels will be coded as deviations from the mean noise level (a value of 3.5); thus, the 6 noise levels are actually -2.5, -1.5, -.5, +.5, +1.5, +2.5. These latter deviation values should be assumed in *everything* that follows.

Summary Information on Performance (the standard deviation is based on an unbiased variance estimate):

| Noise level | Sample Size | Mean | Standard Deviation |
|-------------|-------------|------|--------------------|
| -2.5 | 10 | 27.0 | 6.164 |
| -1.5 | 10 | 37.0 | 6.164 |
| 5 | 10 | 42.0 | 6.164 |
| +.5 | 10 | 32.0 | 6.164 |
| +1.5 | 10 | 22.0 | 6.164 |
| +2.5 | 10 | 14.0 | 6.164 |
| Overall | 60 | 29.0 | 11.087 |

(Any indication that these data are "made up"?)

The end two pages give SYSTAT results on fitting a variety of polynomial models. Here, PER stands for performance and NOISED stands for noise deviated from the mean.

Questions:

a) Plot the data: noise against performance. Indicate on the plot the mean performance level within each noise level.

b) Replot just the mean performance levels within each noise level and on this graph represent all *five* linear/curvilenear functions given by the SYSTAT output. Comment on what appears to provide a "reasonable" fit.

c) Calculate a "pure error" sum-of-squares from the summary information provided for performance. What would a plot in (b) look like if a polynomial of order 5 were fitted? And what would be the residual sum-of-squares? Provide the analysis-of-variance table for fitting the order 5 polynomial. (If in a previous life you studied one-way analysis-of-variance, comment on the correspondence between the last table you gave and what would be usually provided in the one-way analysis of variance context.)

d) Obtain the "extra" sums-of-squares indicated (here, X is the noise level):

 $\begin{aligned} & SSR(X); \, SSR(X^2 \mid X); \\ & SSR(X^3 \mid X, \, X^2); \\ & SSR(X^4 \mid X, \, X^2, \, X^3); \end{aligned}$

 $\begin{aligned} & \text{SSR}(X^5 \mid X, \, X^2, \, X^3, \, X^4); \text{ and} \\ & \text{SSR}(X^3, \, X^4, \, X^5 \mid X, \, X^2) \\ & \text{SSR}(X^4, \, X^5 \mid X, \, X^2, \, X^3). \end{aligned}$

Test whether there is a significant lack-of-fit for a second order and for a third order model using the "pure error" term — give the two corresponding analysis-of-variance tables. Comment on how these tests relate to the intuition you provided in (b).

e) What is the relation between all of the residual mean squares generated in the SYSTAT analyses and the mean square for pure error? Are they all estimates of error? In what sense and under what conditions?

f) Look at the SYSTAT analysis for the third order model. Show numerically how the test for the coefficient on X^3 can be generated using the extra sum of squares principle. In carrying out this test, what assumption is being made about the residual mean-squares for the third order model.

g) Look at the SYSTAT analysis for the second order model. What do the given tolerances tell you about the relation between X and X^2 ? Why should this relation hold here for our data? Comment on the change or lack of change in the regression coefficients as the order of the model increases. How general would you expect such a result to be when other data sets are considered?

Dep Var: PERFORMANCE N: 60 Multiple R: 0.0 Squared multiple R: 0.0Adjusted squared multiple R: 0.000Standard error of estimate:11.087EffectCoefficientStd ErrorStd Coef TolerancetP(2 Tail)CONSTANT29.0001.4310.0.20.2610.000

Dep Var: PERFORMANCE N: 60 Multiple R: 0.533 Squared multiple R: 0.284 Adjusted squared multiple R: 0.272 Standard error of estimate: 9.461 Effect Coefficient Std Error Std Coef Tolerance t P(2 Tail) CONSTANT 29.003 1.221 0.0 . 23.745 0.000 NOISED -3.430 0.715 -0.533 1.000 -4.797 0.000

Analysis of Variance

| Source | Sum-of-Squares | DF | Mean-Square | F-Ratio | Р |
|------------------------|----------------------|---------|--------------------|---------|-------|
| Regression Residual | 2060.151 5191.849 | 1 58 | 2060.151 89.515 | 23.015 | 0.000 |
| | | | | | |

| Dep Var: PERFC | DRMANCE N: 60 Mu | ltiple R: 0 | .809 Squared n | multiple R: | 0.655 | |
|--------------------|------------------|----------------|----------------|-------------|------------------|----------|
| Adjusted squar | ed multiple R: | 0.643 St | andard error o | of estimate | 2: | 6.628 |
| Effect | Coefficient | Std Error | Std Coef To | olerance | t P | (2 Tail) |
| CONSTANT NOISED | 36.837 -3.426 | 1.317 0.501 | 0.0 | 1.000 | 27.962 -6.842 | 0.000 |
| NOISED *NOISED | -2.684 | 0.343 | -0.609 | 1.000 | -7.821 | 0.000 |

Analysis of Variance

| Source | Sum-of-Squares | DF | Mean-Square | F-Ratio | P |
|------------------------|----------------------|---------|--------------------|---------|-------|
| Regression Residual | 4747.738 2504.262 | 2 57 | 2373.869 43.934 | 54.032 | 0.000 |

| Dep Var: PER | RFORMANCE N: 60 MU | ultiple R: (| 0.838 Squared | multiple 1 | R: 0.703 | |
|--|---|---|---|---|---|--|
| Adjusted squ | ared multiple R: | 0.687 St | andard error | of estimat | te: | 6.201 |
| Effect | Coefficient | Std Error | Std Coef I | olerance | t P | |
| CONSTANT | 36.832 | 1.232 | 0.0 | | 00 005 | |
| NOISED | -7.145 | | | | | |
| NOISED | /.110 | T • 2 T / | - 7 • 7 7 0 | 0.127 | -5.425 | 0.000 |
| *NOISED | -2.682 | 0.321 | -0.608 | 1 000 | -8.356 | 0.000 |
| NOISED | | 0.0011 | 0.000 | 1.000 | -0.356 | 0.000 |
| *NOISED | | | | | | |
| *NOISED | 0.736 | 0.244 | 0.618 | 0.127 | 3.021 | 0 004 |
| | | 0.211 | 0.010 | 0.127 | 3.021 | 0.004 |
| | | Analysis of | Variance | | | |
| Source | Sum-of-Squ | ares DF M | lean-Square | F-Ratio | P | |
| Dogradation | | | | | | |
| Regression Residual | 5098. | 694 3 | 1699.565 | 44.200 | 0.0 | 00 |
| | 2153. | 306 56 | 38.452 | | | |
| | FORMANCE N: 60 Mu | | | | | |
| Dep Var: PER | | ltiple R: 0 | .843 Squared 1 | multiple R | 2: 0.710 | |
| Dep Var: PER Adjusted squa | FORMANCE N: 60 Mu | ltiple R: 0 0.689 St | .843 Squared andard error o | multiple R of estimat | e: 0.710 | 6.182 |
| Dep Var: PER Adjusted squa Effect | FORMANCE N: 60 Mu ared multiple R: Coefficient | ltiple R: 0 0.689 St Std Error | .843 Squared m andard error of Std Coef To | multiple R of estimat olerance | t P(| 6.182 2 Tail) |
| Dep Var: PER Adjusted squa Effect CONSTANT | FORMANCE N: 60 Mu ared multiple R: | ltiple R: 0 0.689 St Std Error 1.642 | .843 Squared m andard error of Std Coef To 0.0 | multiple R of estimat olerance | e: 0.710 e: t P(23.199 | 6.182 2 Tail) 0.000 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 | ltiple R: 0 0.689 St Std Error | .843 Squared m andard error of Std Coef To 0.0 | multiple R of estimat olerance | e: 0.710 e: t P(23.199 | 6.182 2 Tail) 0.000 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 | ltiple R: 0 0.689 St Std Error 1.642 1.313 | .843 Squared m andard error of Std Coef To 0.0 -1.110 | multiple R of estimat olerance 0.127 | e: 0.710 e: t P(23.199 -5.439 | 6.182 2 Tail) 0.000 0.000 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED *NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 -7.142 | ltiple R: 0 0.689 St Std Error 1.642 | .843 Squared m andard error of Std Coef To 0.0 -1.110 | multiple R of estimat olerance 0.127 | e: 0.710 e: t P(23.199 | 6.182 2 Tail) 0.000 0.000 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED NOISED NOISED NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 -7.142 | ltiple R: 0 0.689 St Std Error 1.642 1.313 | .843 Squared m andard error of Std Coef To 0.0 -1.110 | multiple R of estimat olerance 0.127 | e: 0.710 e: t P(23.199 -5.439 | 6.182 2 Tail) 0.000 0.000 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED *NOISED NOISED *NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 -7.142 | ltiple R: 0 0.689 St Std Error 1.642 1.313 1.494 | .843 Squared m andard error of Std Coef To 0.0 -1.110 -0.991 | multiple R of estimat olerance 0.127 0.046 | t P(23.199 -5.439 -2.925 | 6.182 2 Tail) 0.000 0.000 0.005 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED *NOISED *NOISED *NOISED *NOISED *NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 -7.142 -4.369 | ltiple R: 0 0.689 St Std Error 1.642 1.313 | .843 Squared m andard error of Std Coef To 0.0 -1.110 | multiple R of estimat olerance 0.127 0.046 | e: 0.710 e: t P(23.199 -5.439 | 6.182 2 Tail) 0.000 0.000 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED *NOISED *NOISED *NOISED *NOISED VOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 -7.142 -4.369 | ltiple R: 0 0.689 St Std Error 1.642 1.313 1.494 | .843 Squared m andard error of Std Coef To 0.0 -1.110 -0.991 | multiple R of estimat olerance 0.127 0.046 | t P(23.199 -5.439 -2.925 | 6.182 2 Tail) 0.000 0.000 0.005 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 -7.142 -4.369 | ltiple R: 0 0.689 St Std Error 1.642 1.313 1.494 | .843 Squared m andard error of Std Coef To 0.0 -1.110 -0.991 | multiple R of estimat olerance 0.127 0.046 | t P(23.199 -5.439 -2.925 | 6.182 2 Tail) 0.000 0.000 0.005 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 -7.142 -4.369 0.736 | ltiple R: 0 0.689 St Std Error 1.642 1.313 1.494 0.243 | .843 Squared m andard error of Std Coef To 0.0 -1.110 -0.991 0.618 | multiple R of estimat olerance 0.127 0.046 0.127 | e: 0.710 e: t P(23.199 -5.439 -2.925 3.029 | 6.182 2 Tail) 0.000 0.000 0.005 0.004 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 -7.142 -4.369 | ltiple R: 0 0.689 St Std Error 1.642 1.313 1.494 | .843 Squared m andard error of Std Coef To 0.0 -1.110 -0.991 | multiple R of estimat olerance 0.127 0.046 | t P(23.199 -5.439 -2.925 | 6.182 2 Tail) 0.000 0.000 0.005 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 -7.142 -4.369 0.736 0.249 | ltiple R: 0 0.689 St Std Error 1.642 1.313 1.494 0.243 | .843 Squared m andard error of Std Coef To 0.0 -1.110 -0.991 0.618 0.392 | multiple R of estimat olerance 0.127 0.046 0.127 | e: 0.710 e: t P(23.199 -5.439 -2.925 3.029 | 6.182 2 Tail) 0.000 0.000 0.005 0.004 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 -7.142 -4.369 0.736 0.249 | ltiple R: 0 0.689 St Std Error 1.642 1.313 1.494 0.243 0.215 Analysis of V | .843 Squared m andard error of Std Coef To 0.0 -1.110 -0.991 0.618 0.392 | multiple R of estimat olerance 0.127 0.046 0.127 | e: 0.710 e: t P(23.199 -5.439 -2.925 3.029 | 6.182 2 Tail) 0.000 0.000 0.005 0.004 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 -7.142 -4.369 0.736 0.249 Zum-of-Squa | ltiple R: 0 0.689 St Std Error 1.642 1.313 1.494 0.243 0.215 Analysis of V ares DF Me | .843 Squared m andard error of Std Coef To 0.0 -1.110 -0.991 0.618 0.392 Variance ean-Square | multiple R of estimat olerance 0.127 0.046 0.127 0.046 F-Ratio | <pre>2: 0.710 .e: t P(23.199 -5.439 -2.925 3.029 1.156 P</pre> | 6.182 2 Tail) 0.000 0.005 0.004 0.253 |
| Dep Var: PER Adjusted squa Effect CONSTANT NOISED NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED *NOISED | FORMANCE N: 60 Mu ared multiple R: Coefficient 38.091 -7.142 -4.369 0.736 0.249 | ltiple R: 0 0.689 St Std Error 1.642 1.313 1.494 0.243 0.243 0.215 Analysis of V ares DF Me | .843 Squared m andard error of Std Coef To 0.0 -1.110 -0.991 0.618 0.392 Variance | multiple R of estimat olerance 0.127 0.046 0.127 0.046 | <pre>2: 0.710 .e: t P(23.199 -5.439 -2.925 3.029 1.156</pre> | 6.182 2 Tail) 0.000 0.005 0.004 0.253 |