

Group E Surname, name: _____ Signature: _____

1) [4 points] One experiment has been conducted to study the effect of type of processor and algorithm on the time required to inverse big data matrixes. For this purpose, two matrixes of similar characteristics (matrix_1 and matrix_2) have been inversed with 3 different algorithms (AL1, AL2, AL3) and with 3 types of processors (A, B, C), resulting 18 values of time (in milliseconds). Processor A has a RAM memory of 10 MB, processor B has 30 MB of RAM, and C has 20 MB of RAM. Data were analyzed with ANOVA, resulting the following table. Factor “matrix” was not statistically significant and it was not considered in this study.

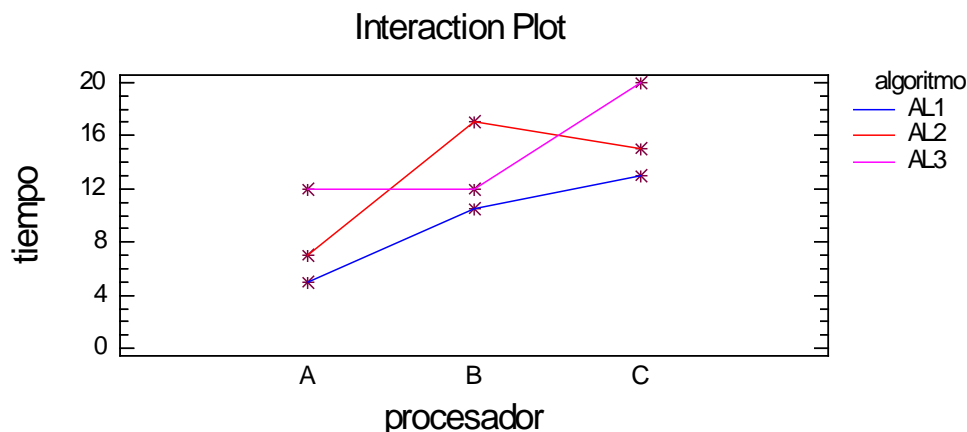
Analysis of Variance for TIME - Type III Sums of Squares

Source	Sum of Squares	Df	Mean Square	F-Ratio
MAIN EFFECTS				
A:processor	197,444			
B:algorithm			41,7222	
INTERACTIONS				
AB	66,8889			
RESIDUAL				
TOTAL (CORRECTED)	416,278			

1a) Complete the summary table of ANOVA. [1 point]

1b) What effects are statistically significant, considering $\alpha=0.05$? Justify conveniently the answer. [1 point]

1c) The interaction plot corresponding to both factors is shown below. What information is deduced from this plot, taking into account the results in the ANOVA table? [1 point]



1d) Based on the plot shown above, obtain the Means Plot for the factor “processor”. Draw also the LSD intervals, taking into account that the total width of these LSD intervals (for a confidence level of 95%) is 3.6 units (that is, $\bar{x}_i \pm 1.8$). [0.5 points]

1e) Based on the plot obtained in question d), can we affirm that the RAM memory of processors used in this experiment has a linear or quadratic effect on the time for matrix inversion? Justify your answer. [0.5 points]

2) One researcher intends to design an experiment with all factors either at 2 levels, or at 3 levels. What is the main advantage of using all factors at 3 levels? What is the main disadvantage? [1 point]

3) [2.5 points] The computer department of a mobile phone company wants to obtain a statistical model to predict the monthly expenses (€) of customers who hire a certain telephone rate (restricted to people over 20 years). A representative sample of customers is randomly selected, and two variables are considered: age and time spent in the company (years). Data were analyzed with Statgraphics, and the following table was obtained:

Multiple Regression Analysis

Dependent variable: EXPENSES

Parameter	Estimate	Standard Error	T Statistic	P-Value
CONSTANT	45,0561	3,73421	12,0658	0,0000
Age	-0,16612	0,0708991		
Time	3,22028	0,354496	9,08411	0,0000

Analysis of Variance

Source	Sum of Squares	Df	Mean Square	F-Ratio	P-Value
Model	9315,25	2	4657,63	43,24	0,0000
Residual	10556,5	98	107,72		

Answer the following questions, justifying conveniently your responses.

3a) One technician considers that age does not affect the expenses at the population level because the estimated regression coefficient of this variable is small (value of -0.16612). Considering $\alpha=0.05$, is it possible to admit the opinion of the technician? [1 punto]

3b) Calculate the monthly expenses expected for a customer of age 40 years who has remained in the company for 3 years. [0.5 puntos]

3c) If a customer of age 40 years has remained 3 years in the company, what is the probability to spend more than 45 euros in one month? [1 point]

4) [2.5 p.] Given these pairs of values: (X=1, Y=5), (X=2, Y=7), (X=4, Y=9), (X=5; Y=11),

a) Calculate the covariance: $\text{cov}(X;Y)$.

b) The variance of X is 10/3. If a simple linear regression is fitted with these pairs of values, obtain the mathematical equation of the regression model.

c) Calculate the residual corresponding to X=1.

SOLUTION

1a) Total degrees of freedom (DF) = $n^0 \text{ data} - 1 = 17$. $DF_A = DF_B = n^0 \text{ variants} - 1 = 3 - 1 = 2$.
 DF of the interaction = $2 \cdot 2 = 4$. DF residual = $17 - 2 - 2 - 4 = 9$.
 $SS_B = 41.722 \cdot 2 = 83.444$; $SS_{res} = 416.28 - 197.44 - 83.44 - 66.89 = 68.5$
 $MS = SS / df$; $F\text{-ratio} = MS / MS_{res}$ The complete ANOVA table is the following:

Analysis of Variance for TIME - Type III Sums of Squares

Source	Sum of Squares	Df	Mean Square	F-Ratio	P-Value
MAIN EFFECTS					
A:processor	197,444	2	98,7222	12,97	0,0022
B:algorithm	83,4444	2	41,7222	5,48	0,0277
INTERACTIONS					
AB	66,8889	4	16,7222	2,20	0,1502
RESIDUAL	68,5	9	7,61111		
TOTAL (CORRECTED)	416,278	17			

1b) $F_{ratio_A} \approx F_{2;9}$; $F_{ratio_B} \approx F_{2;9}$; $F_{ratio_{A \cdot B}} \approx F_{4;9}$ Considering $\alpha=0.05$, the null hypothesis is rejected if the F-ratio obtained is higher than the critical value from the table: $F_{2;9}^{0.05} = 4.26$; $F_{4;9}^{0.05} = 3.63$

As the F-ratios for factor processor (12.97) and for factor algorithm (5.48) are higher than 4.26, the null hypothesis is rejected: the simple effect of both factors is statistically significant.

As the F-ratio of the interaction: $2.2 < 3.63$, there is not enough evidence to affirm that the double interaction between both factors is statistically significant.

Note: p-values cannot be computed "by hand", but they have also been included in the table.

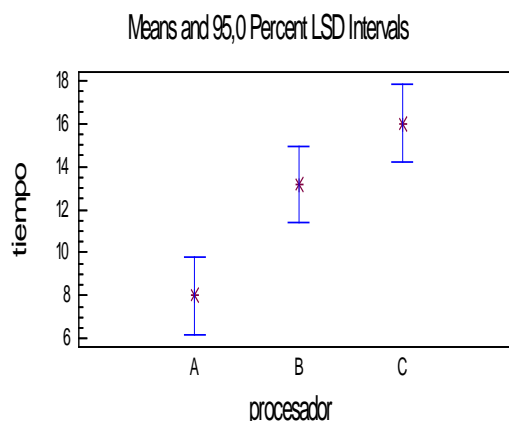
1c) The null hypothesis associated to factor processor is $H_0: m_{procA} = m_{procB} = m_{procC}$. According to the results from the ANOVA table, the null hypothesis is rejected. Based on the interaction plot, the average time of A is lower than the time for B and lower than C. At the population level, the average time of A will be lower than in the case of C, but with the information available it is not possible to know if the average time of F differs significantly from the others.

Similarly, the null hypothesis associated to factor algorithm is that the average time for AL1, AL2 and AL3 is the same. According to question 1b), this null hypothesis is rejected. Based on the interaction plot, it can be deduced that the average time for AL1 [$\text{mean} = (5+10+13)/3$] is lower than for AL2 [$\text{mean} = (7+17+15)/3$] and also lower than in the case of AL3 [$\text{mean} = (12+12+20)/3$]. Thus, it can be concluded that algorithm 1 will require less time in average, at the population level, than algorithm 3, but it is not clear if the average time of AL2 will differ significantly from the others.

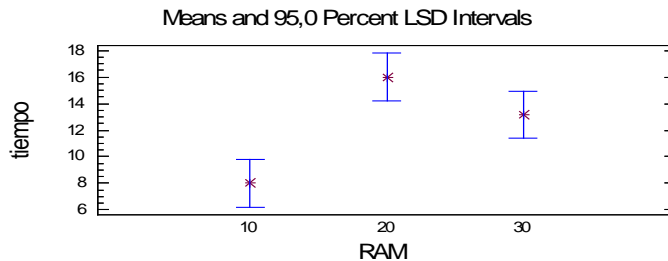
The interaction plot also shows that the three lines (AL1, AL2, AL3) are not parallel. However, the double interaction is not statistically significant. Therefore, there is not enough evidence to conclude that the effect of processor depends on the type of algorithm, or vice versa.

1d) The values deduced from the interaction plot are indicated in the following table. From these values it is possible to calculate the average time for each type of processor. LSD interval for processor A: 8 ± 1.8 ; processor B: 13 ± 1.8 ; processor C: 16 ± 1.8 . These intervals are drawn in the following figure:

processor	algorithm	time	mean
A	AL1	5	8
A	AL2	7	
A	AL3	12	
B	AL1	10	13
B	AL2	12	
B	AL3	17	
C	AL1	13	16
C	AL2	15	
C	AL3	20	



1e) The figure obtained in the previous section seems to indicate that the effect of processor is linear. But this is not the case, because processor A has a RAM memory of 10 MB, B has 30 MB and C has 20 MB. If the order of the variants (processors) is changed according to the RAM memory, the following figure is obtained. Taking into account that the LSD interval for 10 RAM does not overlap with the other two intervals, and given that the relationship is not linear, it can be deduced that there is a quadratic relationship between time and RAM memory. A relative maximum value of time is reached corresponding to a RAM memory slightly lower than 20 MB.



2) The advantage of using an experimental design with all factors at 3 levels is that it is possible to study if the effect is linear or quadratic, in case of being statistically significant. The disadvantage is that the total number of experimental trials required is obviously higher than in the case of factors at two levels.

3a) Total degrees of freedom (DF) appearing in the global significance test of the model = N-1:
 $DF_{\text{total}} = DF_{\text{model}} + DF_{\text{residual}} = 98 + 2 = 100 = N-1$. Thus, N=101 (number of observations in the model).

In the model: $Expenses = \beta_0 + \beta_1 \cdot age + \beta_2 \cdot time$, the null hypothesis $H_0 : \beta_1 = 0$ will be accepted if the following condition is satisfied: $|b_1 / S_{b_1}| < t_{N-1-l}^{\alpha/2}$. In this case, l=2 (two explicative variables in the model), N=101, $b_1 = -0.16612$ (estimated value of the coefficient associated to age), $s_{b_1} = 0.0708991$ (standard error)
 Critical value from the t-table: $t_{N-1-l}^{\alpha} = t_{101-1-2}^{0.025} = t_{98}^{0.025} = 1.99$

The ratio $|b_1 / S_{b_1}| = |-0.16612 / 0.0708991| = 2.343$ is higher than the critical value 1.99 and, hence, the null hypothesis is rejected. Thus, there is enough evidence to conclude that the coefficient β_1 is different from zero at the population. Therefore, the opinion of the technician is **NOT** admissible.

3b) Regression equation: $Expenses = 45.0561 - 0.16612 \cdot age + 3.22028 \cdot time$
 If age=40 and time=3: $E(expenses) = 45.0561 - 0.16612 \cdot 40 + 3.22028 \cdot 3 = \mathbf{48.07}$ eur

3c) Residual variance = residual square mean = 107.72
 If age=40 and time=3: $P(expenses > 45) = P[N(m=48.07; s^2=107.72) > 45] =$
 $= P[N(0;1) > (45 - 48.07) / \sqrt{107.72}] = P[N(0;1) > -0.296] = 1 - 0.384 = \mathbf{0.616}$

4a) $\bar{x} = 3$; $\bar{y} = 8$; $cov(x, y) = \sum (x_i - \bar{x}) \cdot (y_i - \bar{y}) / (n-1)$
 $cov = [(1-3) \cdot (5-8) + (2-3) \cdot (7-8) + (4-3) \cdot (9-8) + (5-3) \cdot (11-8)] / 3 = (6+1+1+6) / 3 = 14/3 = \mathbf{4.67}$

4b) $b = cov / s_x^2 = (14/3) / (10/3) = 1.4$; $a = \bar{y} - b \cdot \bar{x} = 8 - 1.4 \cdot 3 = 3.8$
 Regression line: $y = 3.8 + 1.4 \cdot x$

4c) $residual_{x=1} = y_{observed} - y_{predicted} = 5 - (3.8 + 1.4 \cdot 1) = 5 - 5.2 = \mathbf{-0.2}$