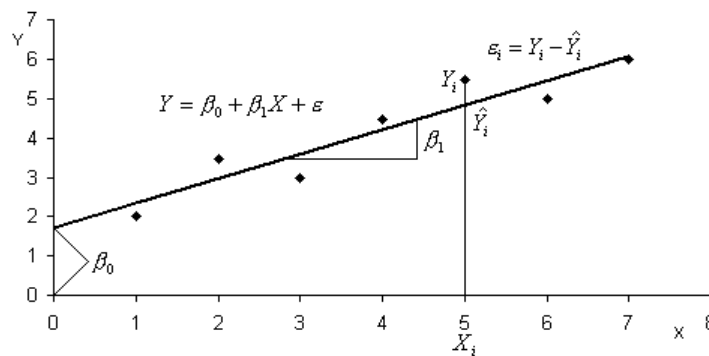


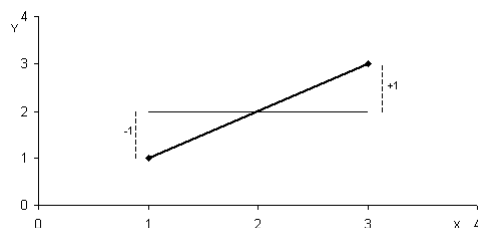
REGRESSÃO E CORRELAÇÃO



AJUSTE DE UMA RETA



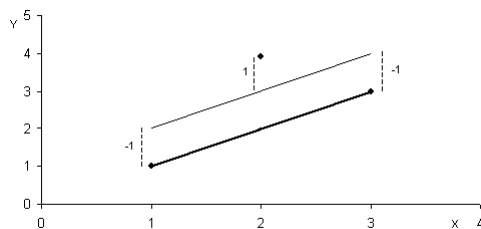
MINIMIZAÇÃO DOS DESVIOS



$$\sum (y_i - \hat{y}_i)$$

3

MINIMIZAÇÃO DOS DESVIOS ABSOLUTOS



$$\sum |y_i - \hat{y}_i|$$

4



EXEMPLO 1

- Considere o seguinte conjunto de pontos

X	Y
1	1
2	1
3	2
4	2
5	4

5



RETAS DE AJUSTE

R1 $Y = -0.1 + 0.7X$

R2 $Y = 0.5 + 0.5X$

R3 $Y = -0.7 + 0.9X$

6

RETAS



R1	R2	R3
0.6	1	0.2
1.3	1.5	1.1
2	2	2
2.7	2.5	2.9
3.4	3	3.8

7

DESVIOS



Desv1	Desv2	Desv3
0.4	0	0.8
-0.3	-0.5	-0.1
0	0	0
-0.7	-0.5	-0.9
0.6	1	0.2
0	0	0

8

DESVIOS ABSOLUTOS



$ \text{Desv1} $	$ \text{Desv2} $	$ \text{Desv3} $
0.4	0	0.8
0.3	0.5	0.1
0	0	0
0.7	0.5	0.9
0.6	1	0.2
2	2	2

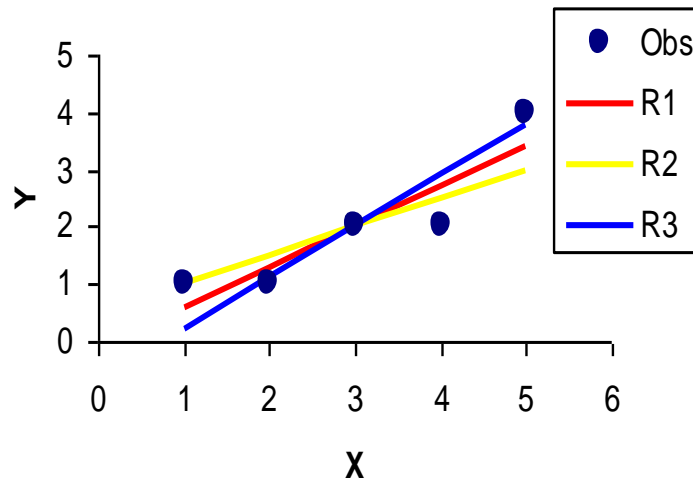
9

QUADRADO DOS DESVIOS



$(\text{Desv1})^2$	$(\text{Desv2})^2$	$(\text{Desv3})^2$
0.16	0	0.64
0.09	0.25	0.01
0	0	0
0.49	0.25	0.81
0.36	1	0.04
1.10	1.50	1.50

10



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EXEMPLO 2

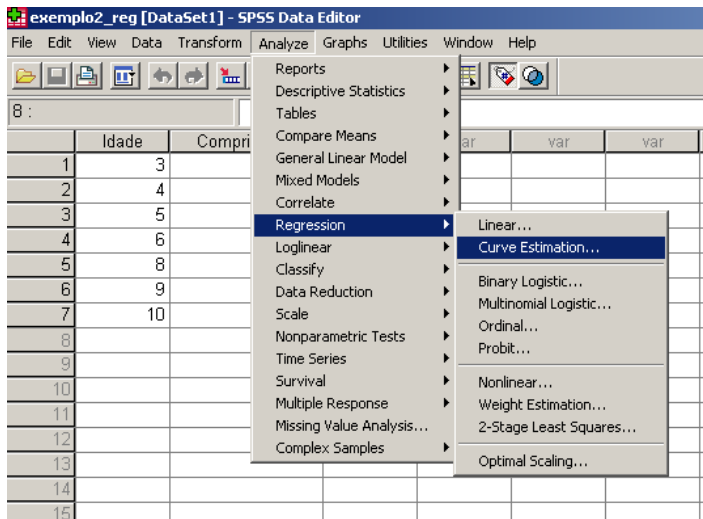


- Comprimento alar (cm) em função da idade (dias) para andorinhas

Dias	Comp.
3	1,4
4	1,5
5	2,1
6	2,4
8	3,1
9	3,2
10	3,3

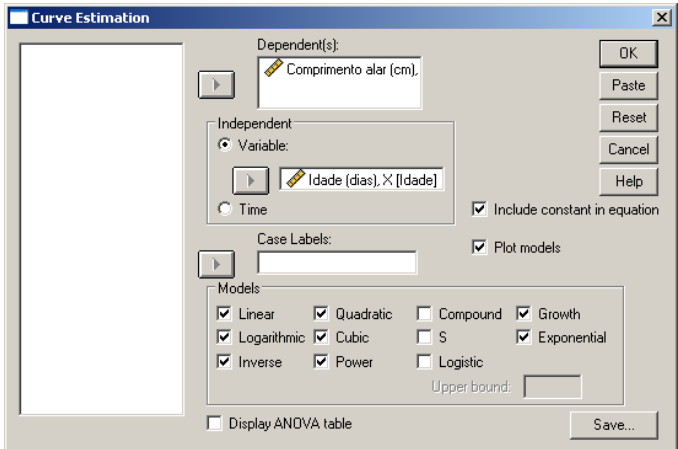
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EXEMPLO 2



13

EXEMPLO 2



14

EXEMPLO 2



Output1 - SPSS Viewer

File Edit View Data Transform Insert Format Analyze Graphs Utilities Window Help

Output

Log

Curve Fit

Notes

Model Description

Case Processing Summary

Variable Processing Summary

Model Summary and Parameter Estimates

Curve Fit for Comprimento

* Curve Estimation.

TSET NEWVAR=NONE .

CURVEFIT /VARIABLES=Comprimento WITH Idade

/CONSTANT

/MODEL=LINEAR LOGARITHMIC INVERSE QUADRATIC CUBIC POWER GROWTH EXPONENTIAL

/PLOT FIT.

Curve Fit

Model Description

Model Name	MOD_2
Dependent Variable	1 Comprimento alar (cm), Y
Equation	1 Linear
	2 Logarithmic
	3 Inverse
	4 Quadratic
	5 Cubic
	6 Power ^a
	7 Growth ^a
	8 Exponential ^a
Independent Variable	Idade (dias), X
Constant	Included
Variable Whose Values Label Observations in Plots	Unspecified
Tolerance for Entering Terms in Equations	,0001

a. The model requires all non-missing values to be positive.

EXEMPLO 2



Output1 - SPSS Viewer

File Edit View Data Transform Insert Format Analyze Graphs Utilities Window Help

Output

Log

Curve Fit

Notes

Model Description

Case Processing Summary

Variable Processing Summary

Model Summary and Parameter Estimates

Curve Fit for Comprimento

Variable Processing Summary

	Variables	
	Dependent	Independent
	Comprimento alar (cm), Y	Idade (dias), X
Number of Positive Values	7	7
Number of Zeros	0	0
Number of Negative Values	0	0
Number of Missing Values	0	0
User-Missing	0	0
System-Missing	0	0

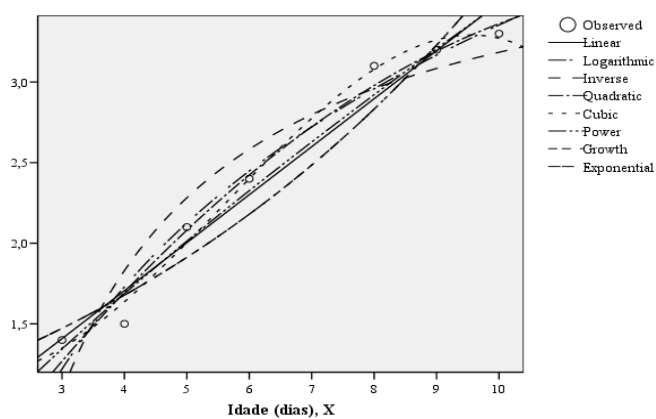
Model Summary and Parameter Estimates

Dependent Variable: Comprimento alar (cm), Y

Equation	Model Summary					Parameter Estimates			
	R Square	F	df1	df2	Sig.	Constant	b1	b2	b3
Linear	,984	132,174	1	5	,000	,515	,298		
Logarithmic	,971	165,753	1	5	,000	-,727	1,772		
Inverse	,915	53,833	1	5	,001	4,087	-9,026		
Quadratic	,980	99,695	2	4	,000	-,274	,579	-,021	
Cubic	,981	106,896	3	3	,002	1,471	-,387	,141	-,00
Power	,968	149,638	1	5	,000	,563	,792		
Growth	,931	67,190	1	5	,000	-,006	,131		
Exponential	,931	67,190	1	5	,000	,994	,131		

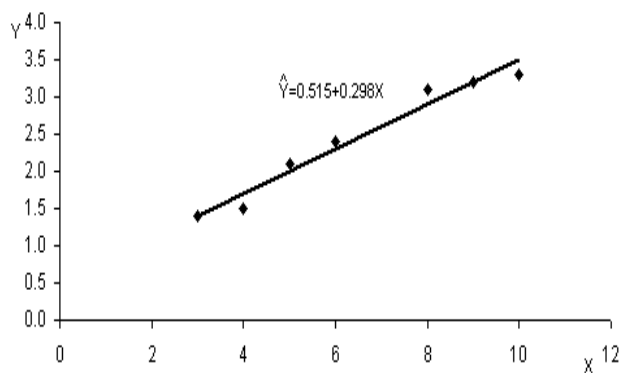
The independent variable is Idade (dias), X.

EXEMPLO 2



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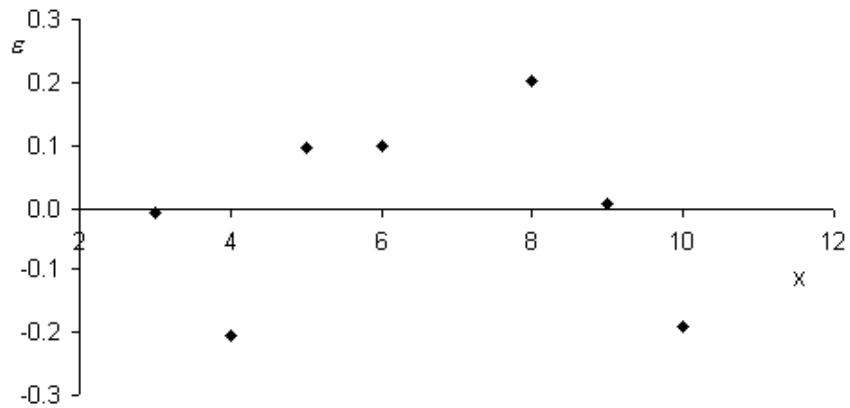
RETA DE MÍNIMOS QUADRADOS



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RESÍDUOS



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Estimadores

$$Y_i = \beta_0 + \beta_1(X_i - \bar{X}) + \varepsilon_i \quad i = 1, \dots, n$$

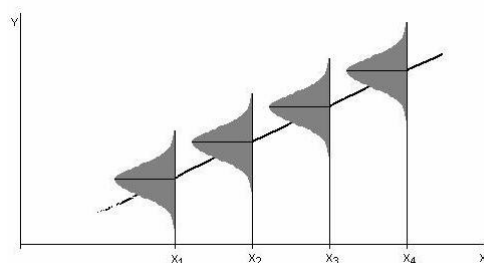
$$\beta_0 \quad \hat{\beta}_0 = \frac{1}{n} \sum_i Y_i = \bar{Y}$$

$$\beta_1 \quad \hat{\beta}_1 = \frac{\sum_i (X_i - \bar{X}) \cdot (Y_i - \bar{Y})}{\sum_i (X_i - \bar{X})^2} = \frac{s_{XY}}{s_{XX}}$$

$$\sigma^2 \quad s^2 = \frac{1}{n-2} \sum_i \hat{\varepsilon}_i^2 = \frac{1}{n-2} \sum_i \left\{ Y_i - \left[\hat{\beta}_0 + \hat{\beta}_1 (X_i - \bar{X}) \right] \right\}^2$$

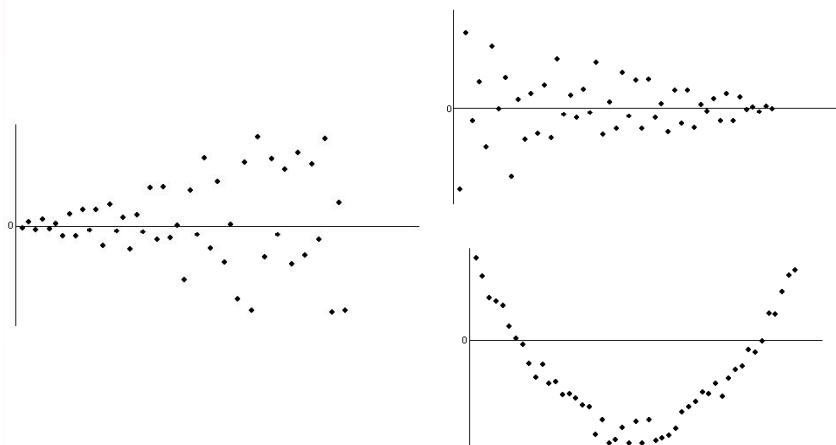
20

DISTRIBUIÇÃO DOS ERROS



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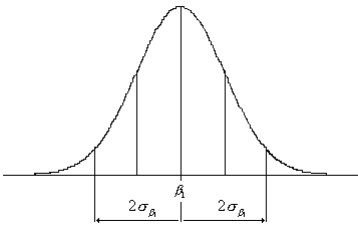
RESÍDUOS



22



DISTRIBUIÇÃO DO DECLIVE



23



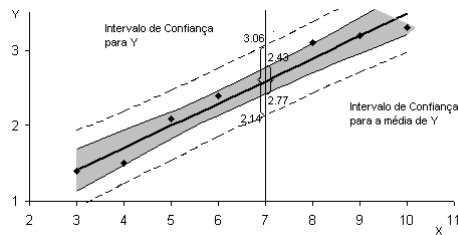
IC e Testes de hipóteses

	IC	TH
β_0	$\hat{\beta}_0 \pm t_{n-2, (\alpha/2)} \cdot \frac{s}{\sqrt{n}}$	<div>$H_0 : \beta_0 = b_0$ $H_1 : \beta_0 \neq b_0, \beta_0 > b_0 \text{ ou } \beta_0 < b_0$ $ET = \frac{\hat{\beta}_0 - b_0}{s / \sqrt{n}}$ $H_0 \text{ verdadeira} \Rightarrow ET \sim t_{n-2}$</div>
β_0'	$(\hat{\beta}_0 - \bar{X} \cdot \hat{\beta}_1) \pm t_{n-2, (\alpha/2)} \cdot s \cdot \sqrt{\frac{1}{n} + \frac{\bar{X}^2}{s_{XX}}}$	<div>$H_0 : \beta_0' = b_0'$ $H_1 : \beta_0' \neq b_0', \beta_0' > b_0' \text{ ou } \beta_0' < b_0'$ $ET = \frac{(\hat{\beta}_0 - \bar{X} \cdot \hat{\beta}_1) - b_0'}{s \cdot \sqrt{\frac{1}{n} + \frac{\bar{X}^2}{s_{XX}}}}$ $H_0 \text{ verdadeira} \Rightarrow ET \sim t_{n-2}$</div>
β_1	$\hat{\beta}_1 \pm t_{n-2, (\alpha/2)} \cdot \frac{s}{\sqrt{s_{XX}}}$	<div>$H_0 : \beta_1 = b_{10}$ $H_1 : \beta_1 \neq b_{10}, \beta_1 > b_{10} \text{ ou } \beta_1 < b_{10}$ $ET = \frac{\hat{\beta}_1 - b_{10}}{\frac{s}{\sqrt{\sum (X_i - \bar{X})^2}}}$ $H_0 \text{ verdadeira} \Rightarrow ET \sim t_{n-2}$</div>

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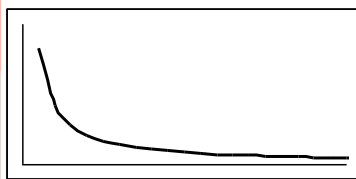
INTERVALO DE CONFIANÇA



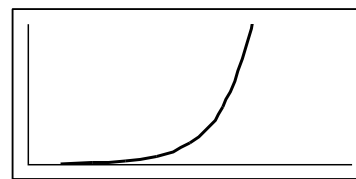
25



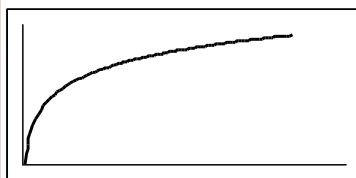
REGRESSÃO NÃO LINEAR



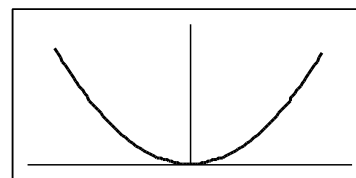
$$\hat{Y} = \beta_0 + \beta_1 \frac{1}{X}$$



$$\hat{Y} = \beta_0 + \beta_1 e^x$$



$$\hat{Y} = \beta_0 + \beta_1 \ln X$$



$$\hat{Y} = \beta_0 + \beta_1 X^2$$

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REGRESSÃO NÃO LINEAR

Modelo	Transformação
<ul style="list-style-type: none">$Y_i = \alpha' + \frac{\beta}{X_i} + e_i$	$U_i = \frac{1}{X_i}$ $Y_i = \alpha' + \beta.U_i + e_i$
<ul style="list-style-type: none">$Y_i = e^{\alpha' + \beta.X_i + e_i}$	$Z_i = \ln Y_i$ $Z_i = \alpha' + \beta.X_i + e_i$
<ul style="list-style-type: none">$Y_i = e^{\alpha' + \frac{\beta}{X_i} + e_i}$ com $\alpha' > 0, \beta < 0$	$U_i = \frac{1}{X_i}$ $Z_i = \ln Y_i$ $Z_i = \alpha' + \beta.U_i + e_i$

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COEFICIENTE DE CORRELAÇÃO

Coeficiente de correlação de Pearson

$$R = \frac{\sum (X_i - \bar{X})(Y_i - \bar{Y})}{\sqrt{\sum (X_i - \bar{X})^2 \sum (Y_i - \bar{Y})^2}} = \frac{s_{XY}}{\sqrt{s_{xx}} \cdot \sqrt{s_{YY}}}$$

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TESTES DE ASSOCIAÇÃO

Unilateral à direita

$$H_0 : \rho = 0$$

$$H_1 : \rho > 0$$

Unilateral à esquerda

$$H_0 : \rho = 0$$

$$H_1 : \rho < 0$$

Bilateral

$$H_0 : \rho = 0$$

$$H_1 : \rho \neq 0$$

Estatística de teste

$$t = \frac{r \cdot \sqrt{n-2}}{\sqrt{1-r^2}}$$

Região de Rejeição:

$$t > t_{n-2,(\alpha)}$$

$$t < -t_{n-2,(\alpha)}$$

$$|t| > t_{n-2,(\alpha/2)}$$

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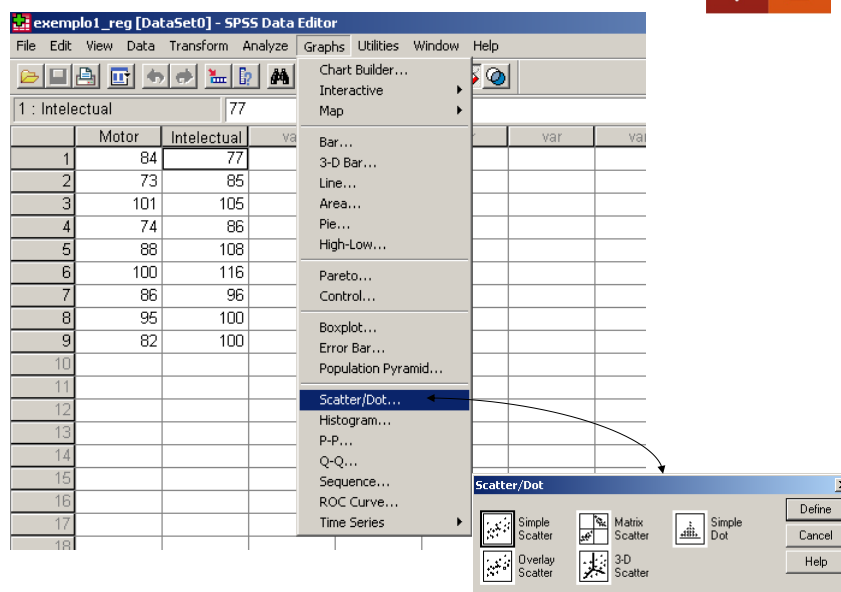


EXEMPLO

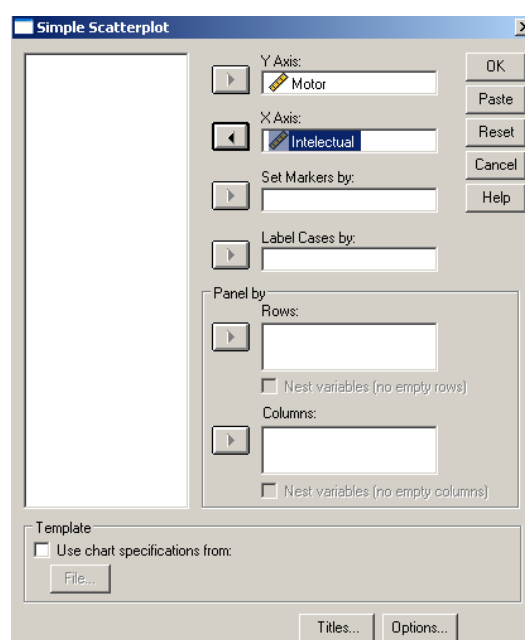
- Índice de Desenvolvimento de Griffiths
- avaliações motora e intelectual para 9 crianças com a idade de 4 anos

Motor	Intelectual
84	77
73	85
101	105
74	86
88	108
100	116
86	96
95	100
82	100

30



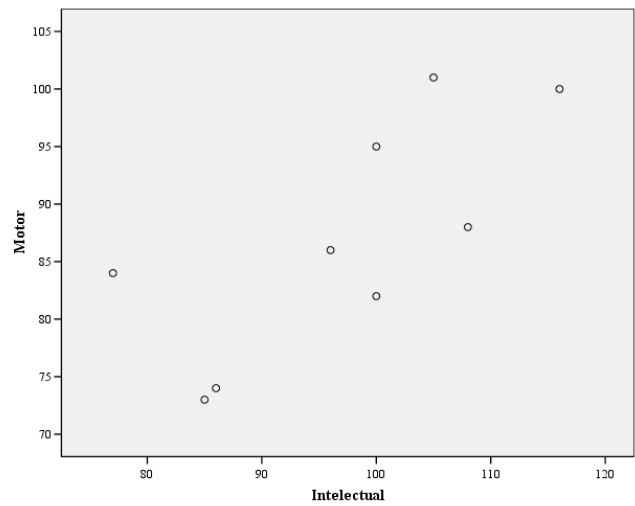
31



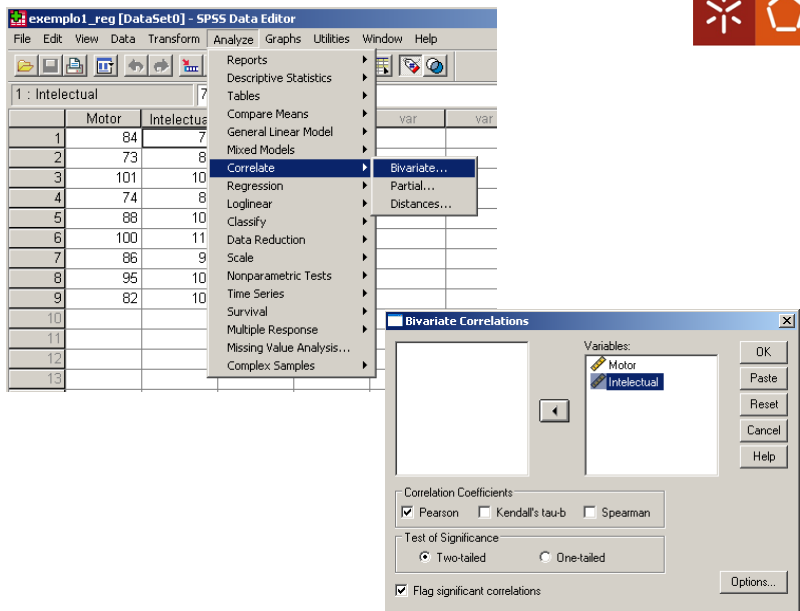
32



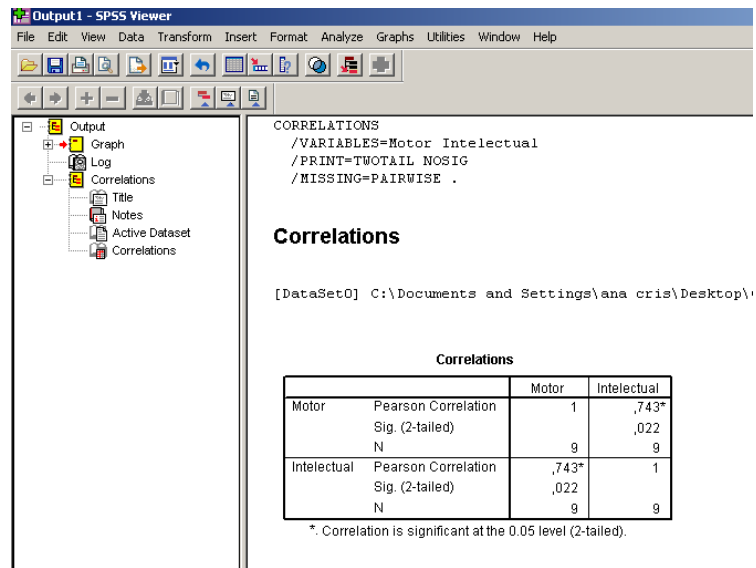
DIAGRAMA DE DISPERSÃO



33

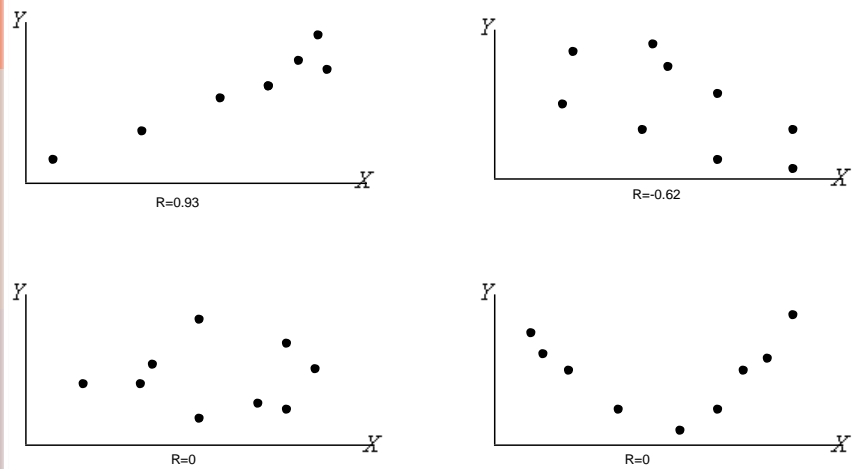


34



35

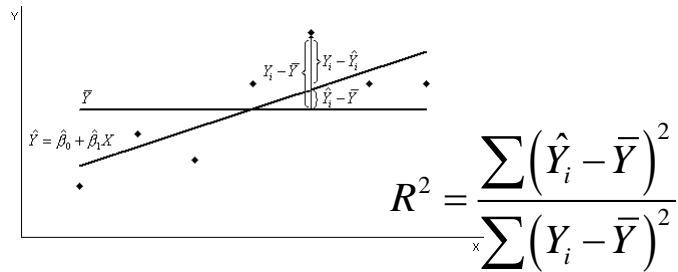
CORRELAÇÃO



36



COEFICIENTE DE DETERMINAÇÃO



37



Coeficiente de determinação (r^2), representa a proporção da variação de Y que é explicada pela regressão

$$r^2 = \frac{\hat{\beta}_1^2 \cdot s_{XX}}{s_{YY}} = \frac{\hat{\beta}_1^2 \cdot \sum_i (X_i - \bar{X})^2}{\sum_i (Y_i - \bar{Y})^2} = \frac{\text{variação de } Y \text{ explicada pela regressão}}{\text{variação total de } Y}$$

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