

MISURANO DELLO STESSA UNITA' STATISTICA DUE VARIABILI CONTINUE

ESEMPIO [Alberi]

Misuro in una popolazione

$x_i$  = il diametro dell' $i$ -esimo albero

$y_i$  = l'età dell' $i$ -esimo albero

Ci chiediamo se queste due variabili sono legate in maniera lineare

$$y_i \stackrel{?}{\approx} \alpha x_i + \beta$$

MEDIA

VARIANZA

$\bar{x}$

$\sigma_x^2$

$\bar{y}$

$\sigma_y^2$

DEFINIZIONE

Si definisce COVARIANZA tra  $x$  e  $y$  la quantità

$$\sigma_{xy} = \frac{1}{N} \sum_{i=1}^N (x_i - \bar{x})(y_i - \bar{y})$$

VARIABILI CONCORDI

SE  $\sigma_{xy} > 0 \Rightarrow$  SE  $x$  CRESCE  $y$  CRESCE e VICEVERSA

VARIABILI DISCORDI

SE  $\sigma_{xy} < 0 \Rightarrow$  SE  $x$  CRESCE  $y$  DECRESCe e VICEVERSA

SE  $\sigma_{xy} = 0 \Rightarrow$  VARIABILI SONO SCORRELATE

DEFINIZIONE

Coefficiente di

**CORRELAZIONE LINEARE**

(od: Bravais-Pearson)

$$\rho_{xy} = \frac{\sigma_{xy}}{\sigma_x \sigma_y}$$

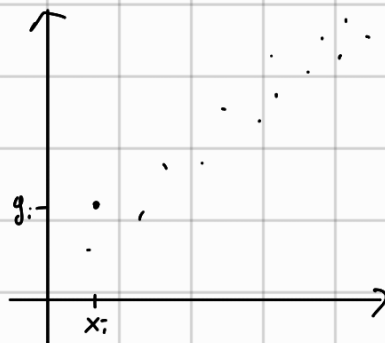
$$\left. \begin{array}{l} \sigma_x = 0 \\ \sigma_y = 0 \end{array} \right\}$$

SI PONE  
 $\rho_{yx} = 0$

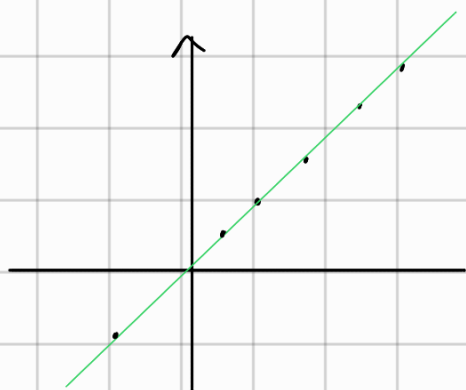
PER RAPPRESENTARE I DATI  
SCATTERSHOT

SI UTILIZZA UNO

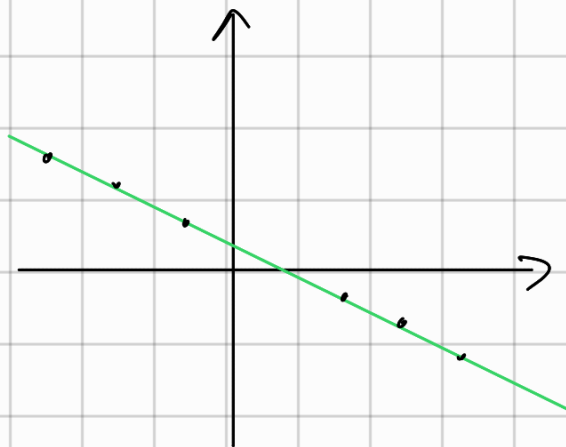
$$-1 \leq \rho_{xy} \leq 1$$



$\rho_{xy}$  CI DICE QUANTO I DATI CHE ABBIAMO SONO VICINI A UNA RETTA  
CORRELAZIONE LINEARE **ESATTA**  $\rho_{xy} = \pm 1$



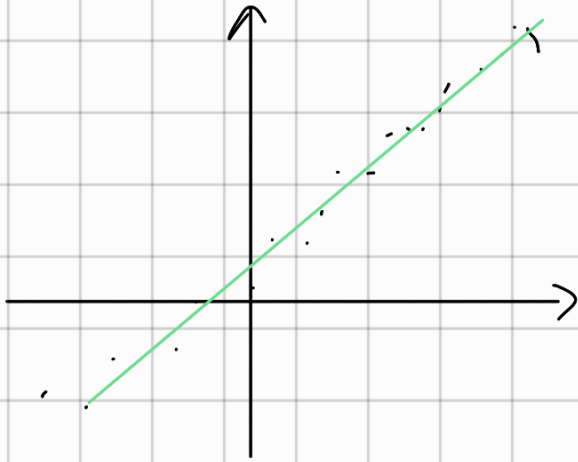
$$\rho_{xy} = 1$$



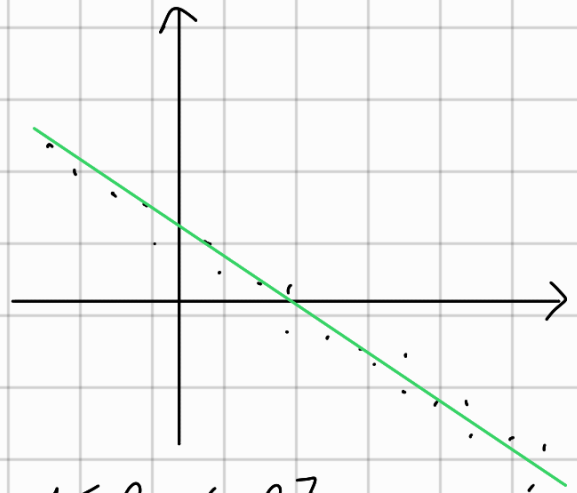
$$\rho_{xy} = -1$$

CORRELAZIONE LINEARE FORTE

$$0.7 < |\rho_{xy}| < 1$$



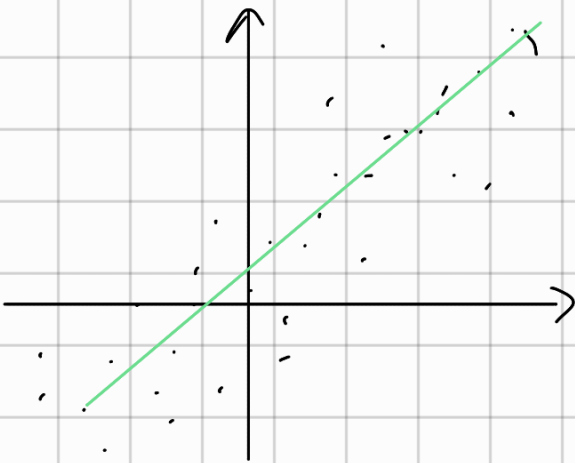
$$0.7 < \rho_{xy} < 1$$



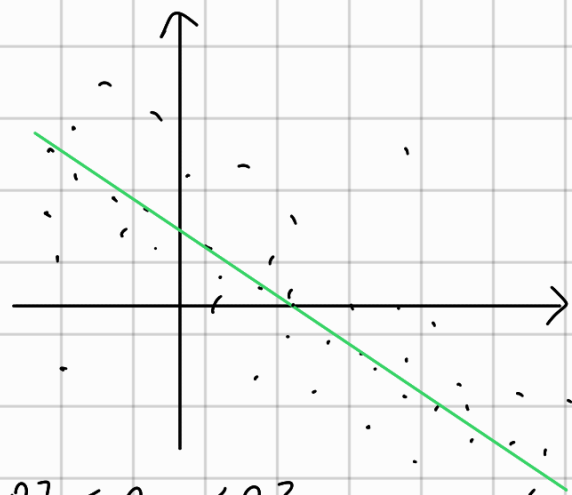
$$-1 < \rho_{xy} < -0.7$$

CORRELAZIONE LINEARE MODERATA

$$0.3 < |\rho_{xy}| < 0.7$$



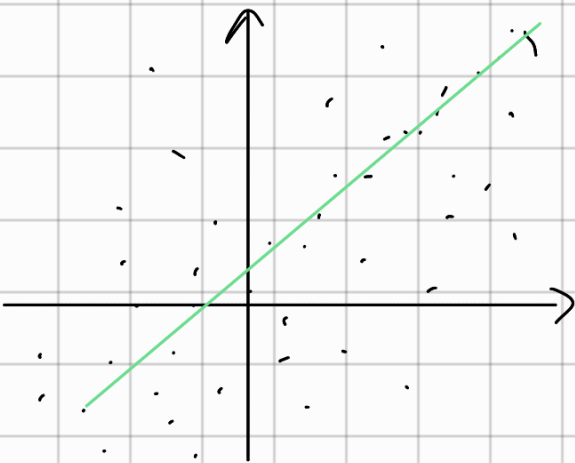
$$0.3 < \rho_{xy} < 0.7$$



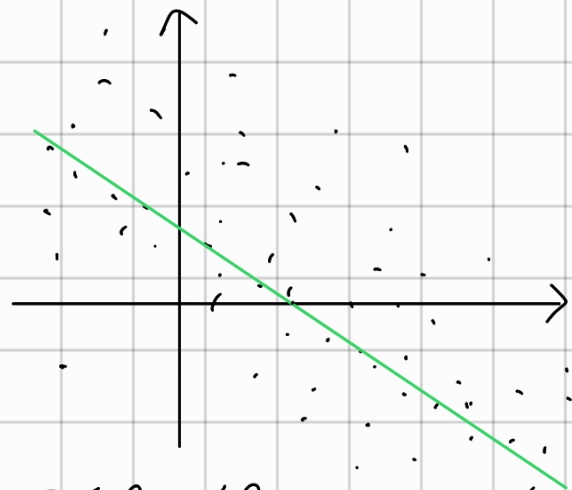
$$-0.7 < \rho_{xy} < 0.3$$

CORRELAZIONE LINEARE DEBOLE

$$0.3 < |\rho_{xy}| < 1$$

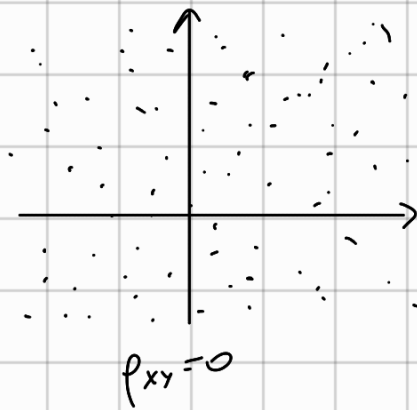


$$0 < \rho_{xy} < 0.3$$



$$-0.3 < \rho_{xy} < 0$$

CORRELAZIONE LINEARE NULLA  $\rho_{xy} = 0$



ESEMPIO:  $\{(1,1), (5,9), (4,7), (10,19), (2,3)\}$   $N=5$   
 $\leftarrow (x_i, y_i)$

$$\bar{x} = \frac{1}{N} \sum_{i=1}^N x_i = \frac{1}{5} (1+5+4+10+2) = \frac{22}{5} = 4.4$$

$$\bar{y} = \frac{1}{N} \sum_{i=1}^N y_i = \frac{1}{5} (1+9+7+19+3) = \frac{39}{5} = 7.8$$

$$\begin{aligned} \sigma_x^2 &= \frac{1}{N} \sum_{i=1}^N (x_i - \bar{x})^2 = \frac{1}{N} [(x_1 - \bar{x})^2 + (x_2 - \bar{x})^2 + (x_3 - \bar{x})^2 + (x_4 - \bar{x})^2 + (x_5 - \bar{x})^2] \\ &= \frac{1}{5} [(-3.4)^2 + (0.6)^2 + (-0.4)^2 + (5.6)^2 + (-2.4)^2] = \frac{49.2}{5} = 9.84 \end{aligned}$$

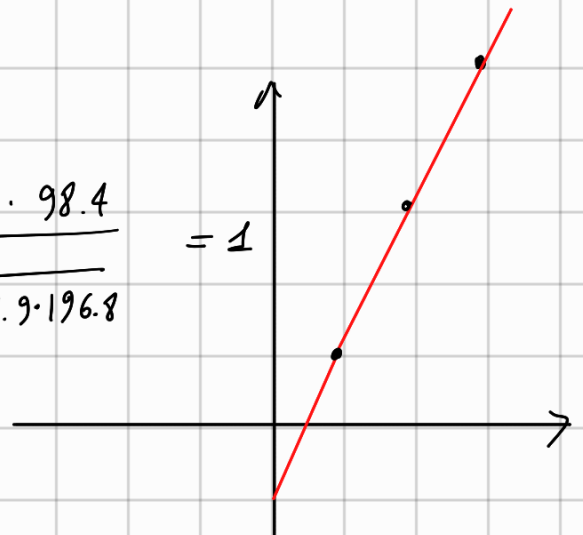
$$\sigma_y^2 = \dots = \frac{196.8}{5}$$

$$\begin{aligned} \sigma_{xy} &= \frac{1}{N} \sum_{i=1}^N (x_i - \bar{x})(y_i - \bar{y}) = \frac{1}{5} [(-3.4)(-6.8) + (0.6)(1.2) + (-0.4)(-0.8) + (5.6)(11.2) + (-2.4)(-4.8)] \\ &= 98.4 \end{aligned}$$

$$\rho_{xy} = \frac{\sigma_{xy}}{\sqrt{\sigma_x \sigma_y}} = \frac{98.4}{\sqrt{\frac{42.9}{5} \cdot \frac{196.8}{5}}} = \frac{5 \cdot 98.4}{\sqrt{42.9 \cdot 196.8}} = 1$$

CORRELAZIONE LINEARE ESATTA

$$y = 2x - 1$$



SE LA CORRELAZIONE NON È ESATTA

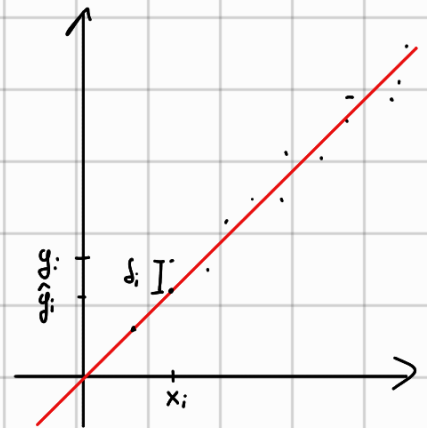
La retta che meglio approssima i dati è detta

RETTE DI REGRESSIONE LINEARE

$$\hat{y}_i = \alpha x_i + \beta$$

$$\delta_i = |y_i - \hat{y}_i|$$

$$y = \alpha x + \beta$$



VUOLIAMO MINIMIZZARE GLI ERRORI

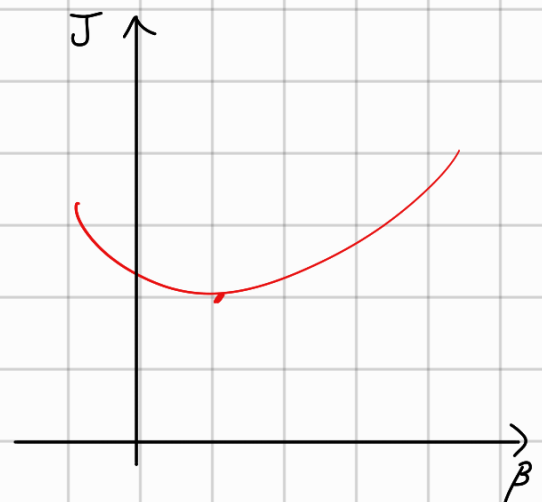
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METODO DEI MINIMI QUADRATI

$$J(\alpha, \beta) = \frac{1}{N} \sum_{i=1}^N \delta_i^2 =$$

$$= \frac{1}{N} \sum_{i=1}^N (y_i - \hat{y}_i)^2 =$$

$$= \frac{1}{N} \sum_{i=1}^N (y_i - \alpha x_i - \beta)^2$$



MINIMIZZIAMO PRIMA RISPETTO A  $\beta$  E POI RISPETTO A  $\alpha$

$$\min_{\alpha} \left[ \min_{\beta} J(\alpha, \beta) \right]$$

CALCOLO LA DERIVATA PRIMA RISPETTO A  $\beta$  (SI INDICA CON  $\frac{\partial J}{\partial \beta}$ )

$$J(\alpha, \beta) = \frac{1}{N} \left( \sum_{i=1}^N (y_i - \alpha x_i - \beta)^2 \right)$$

$$\begin{aligned} \frac{\partial J}{\partial \beta} &= \frac{1}{N} \sum_{i=1}^N \frac{\partial}{\partial \beta} [y_i - \alpha x_i - \beta]^2 \\ &= -\frac{1}{N} \sum_{i=1}^N 2 [y_i - \alpha x_i - \beta] \end{aligned}$$

E' COME SE FOSSE

$$\begin{aligned} &(3 - \beta)^2 \\ &2(3 - \beta)(-1) \end{aligned}$$

$$\begin{aligned} &= -2 \left[ \frac{1}{N} \sum y_i - \alpha \frac{1}{N} \sum x_i - \frac{1}{N} N \beta \right] \\ &= -2 [\bar{y} - \alpha \bar{x} - \beta] = 0 \\ &\Rightarrow \beta = \bar{y} - \alpha \bar{x} \end{aligned}$$

$$\begin{aligned} \min_{\alpha} [J(\alpha, \bar{y} - \alpha \bar{x})] &= \min_{\alpha} \left[ \frac{1}{N} \sum_{i=1}^N [y_i - (\alpha x_i + \bar{y} - \alpha \bar{x})]^2 \right] \\ &= \min_{\alpha} \left[ \frac{1}{N} \sum_{i=1}^N [y_i - \bar{y} - \alpha(x_i - \bar{x})]^2 \right] \end{aligned}$$

FACENDO I CALCOLI

$$\alpha = \frac{\sigma_{xy}}{\sigma_x^2}$$

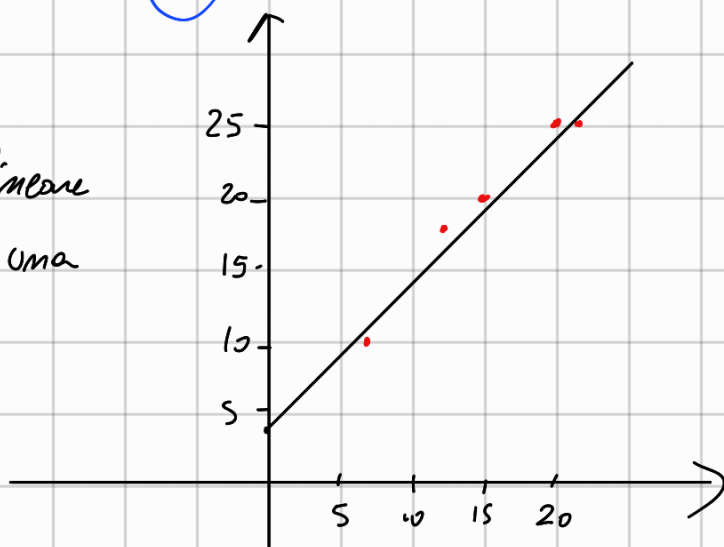
$$\beta = \bar{y} - \frac{\sigma_{xy}}{\sigma_x^2} \bar{x}$$

ESEMPIO  $N=5$

Somministrato una dose  $x_i$  di farmaco e osservato una diminuzione di pressione arteriosa  $y_i$

X ↓ VARIABILE INDIPENDENTE	DOSE (mg)	DIMINUIZIONE (mm Hg)	Y VARIABILE DIPENDENTE
	7	10	70
	12	18	196
	15	20	300
	20	25	500
	22	25	550

- Scrivere la retta di regressione lineare
- Che dose dobbiamo dare se vogliamo una riduzione di circa 15 mmHg
- Di quanto diminuirà la pressione se da una dose di 30 mmHg?



$$y = \alpha x + \beta$$

$$\alpha = \frac{\sigma_{xy}}{\sigma_x}$$

$$\beta = \bar{y} - \frac{\sigma_{xy}}{\sigma_x} \bar{x}$$

$$\bar{x} = \frac{1}{5} (7 + 12 + 15 + 20 + 22) = 15.2$$

$$\bar{y} = \frac{1}{5} (10 + 18 + 20 + 25 + 25) = 19.6$$

$$\sigma_{xy} = \frac{1}{N} \sum_{i=1}^N (x_i - \bar{x})(y_i - \bar{y}) = \frac{1}{N} \sum_{i=1}^N x_i y_i - \bar{x} \bar{y}$$

$$\sigma_{xy} = \left[ \frac{(7-15.2)(10-19.6) + (12-15.2)(18-19.6) + (20-15.2)(20-19.6) + (22-15.2)(25-19.6) + (15-15.2)(25-19.6)}{5} \right] \cdot \frac{1}{5}$$

$$= 29.28$$

$$\sigma_{xy} = \frac{1}{5} (1616) - (15.2)(19.6) = 29.28$$

$$\sigma_x^2 = \frac{1}{5} \left[ (7-15.2)^2 + (12-15.2)^2 + (15-15.2)^2 + (20-15.2)^2 + (22-15.2)^2 \right]$$

$$\frac{1}{5} \left[ (-8.2)^2 + (-3.2)^2 + (-0.2)^2 + (4.8)^2 + (6.8)^2 \right] = 29.36$$

$$\alpha = \frac{\sigma_{xy}}{\sigma_x^2} = \frac{29.28}{29.36} \approx 0.997$$

$$\beta = \bar{y} - \alpha \bar{x} = 19.6 - (0.997)(15.2) = 4.44$$

LARETTA DI REGRESSIONE LINEARE E'

$$y = 0.997x + 4.44$$

SE VOGLIO UNA DIMINUZIONE DI 15 mm Hg che dx devo dare?

$$15 = 0.997x + 4.44$$

$$15 - 4.44 = 0.997x$$

$$\frac{15 - 4.44}{0.997} = x_{15}$$

$$x_{15} \approx 10.59$$



SE DO UNA DOSE DI 30 mmHg ?

$$y_{30} = 0.997 \cdot 30 + 4.44 = 34.36 \text{ mmHg}$$