

# CHAPTER 3

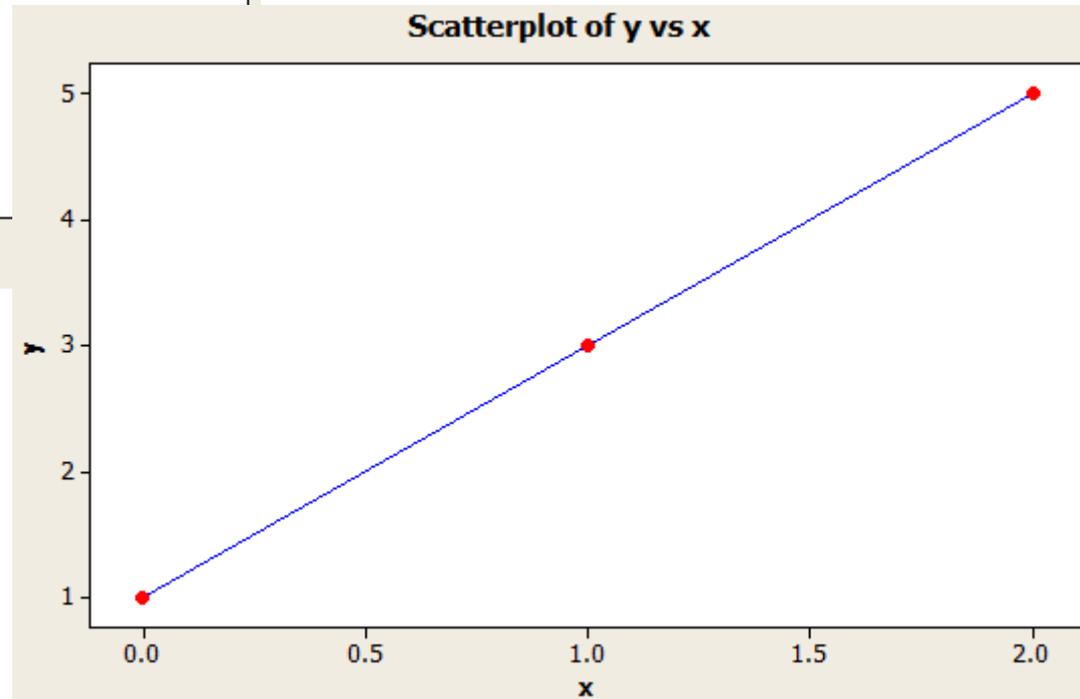
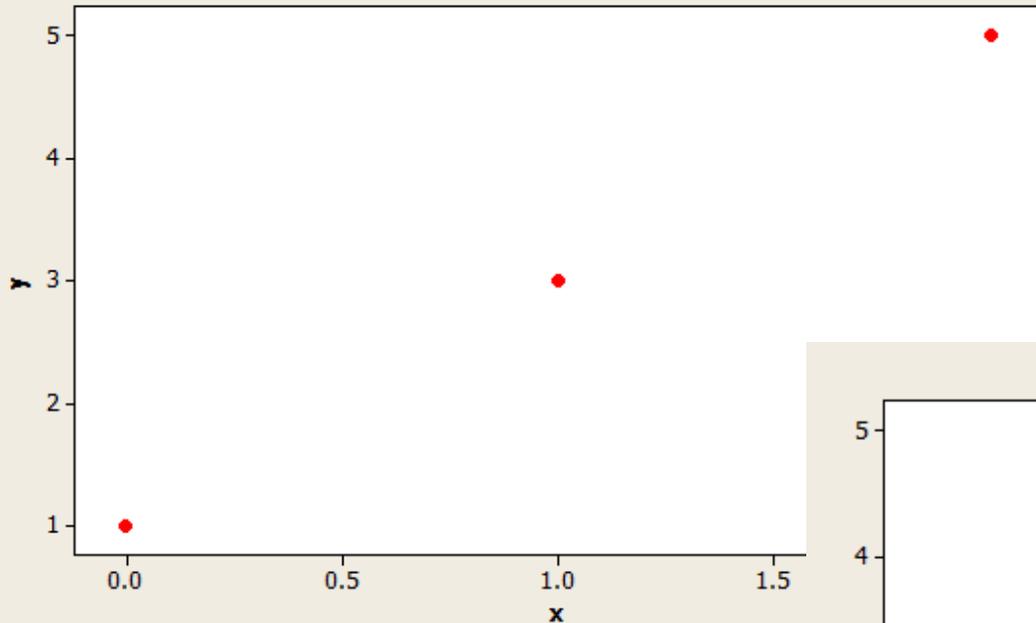


# ANALISIS REGRESI



# No 1

Gambar grafik fungsi  $y = 2x + 1$  dengan  $x=0,1,2$ .

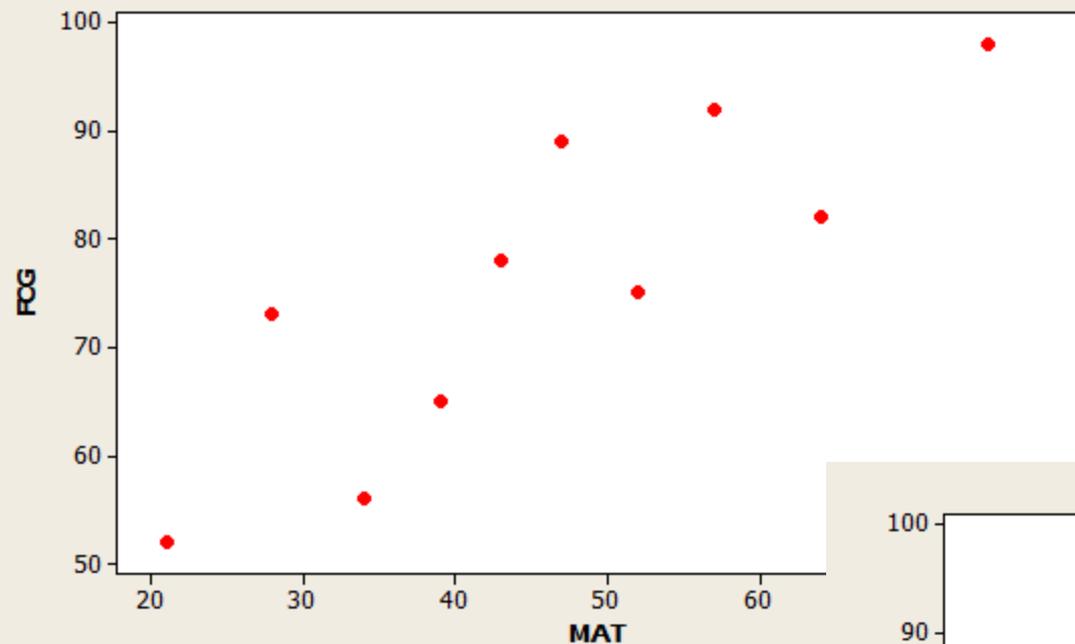


No 2

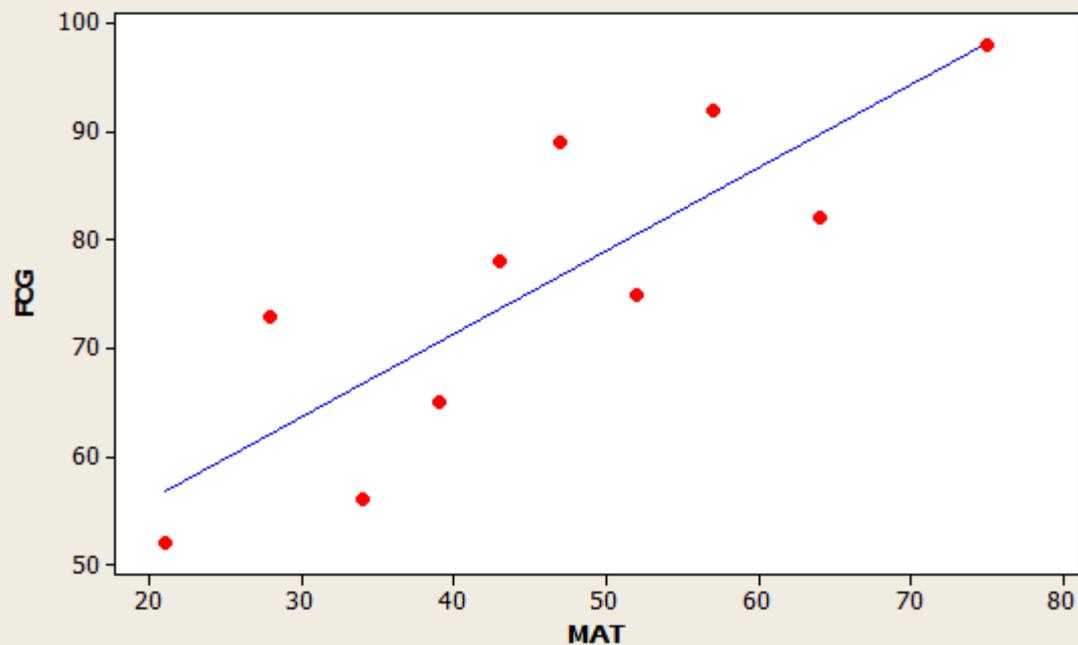
Tabel 1

<u>Mhs</u>	1	2	3	4	5	6	7	8	9	10
<u>MAT</u>	39	43	21	64	57	47	28	75	34	52
<u>FCG</u>	65	78	52	82	92	89	73	98	56	75

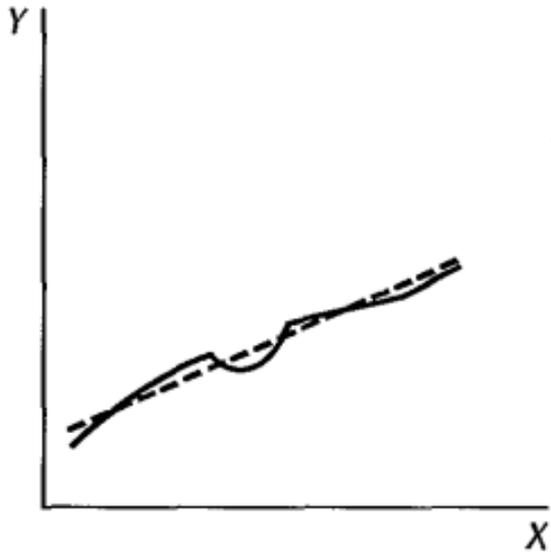
Scatterplot of FCG vs MAT



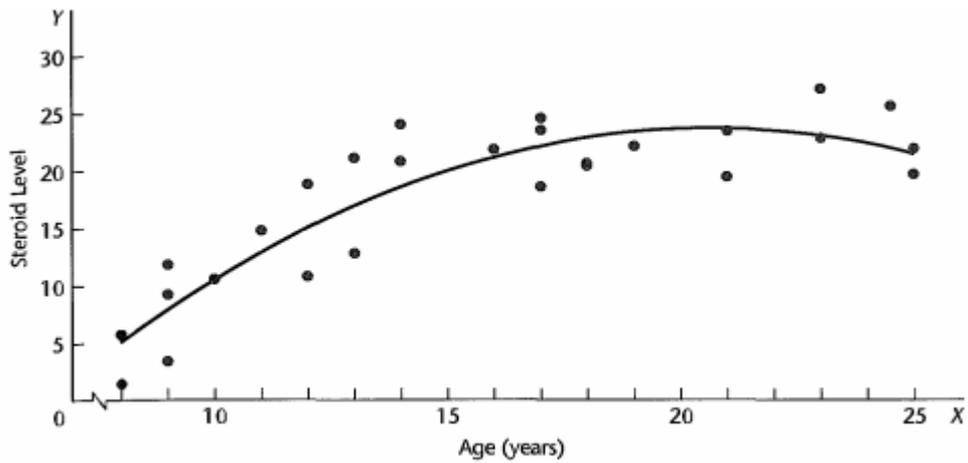
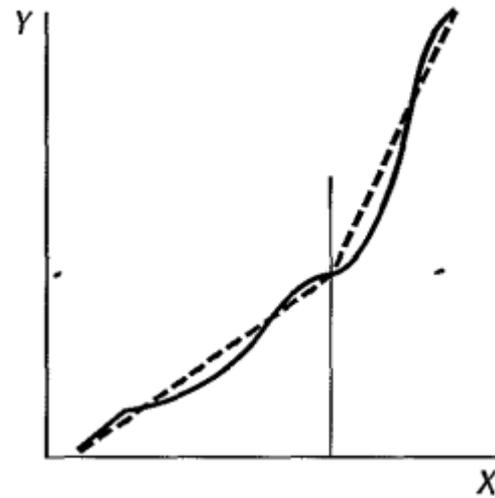
Scatterplot of FCG vs MAT



(a) Linear Approximation



(b) Piecewise Linear Approximation



# An Introduction

Regresi linier sering digunakan untuk melihat nilai prediksi atau perkiraan yang akan datang



Apabila X dan Y mempunyai hubungan, maka nilai X yang sudah diketahui dapat digunakan memperkirakan Y



→ Variable Y yang nilainya akan diramalkan disebut variabel tidak bebas / variabel respon (*dependent variable*)



→ Variable X yang nilainya digunakan untuk meramalkan nilai Y disebut variabel bebas/ peramal/ menerangkan (*independent / explanatory variable*)

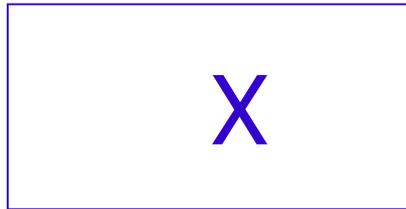


# Beberapa contoh penelitian mengg. anreg..

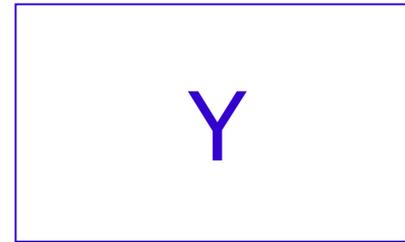
- **Pengaruh Efikasi Diri Terhadap Stres Mahasiswa yang Sedang Menyusun Seminar Makalah di Pendidikan Matematika UNS**
- **ANALISIS FAKTOR – FAKTOR YANG MEMPENGARUHI KEBERHASILAN MAHASISWA P. MATEMATIKA UNS**
- **Pengaruh Gaya Kepemimpinan dan Kreativitas Dosen di Kelas terhadap Prestasi Belajar Mahasiswa**
- **PENGARUH KEAKTIFAN DALAM KEGIATAN UKM TERHADAP SOFTSKILL DAN PRESTASI MAHASISWA**



Prediktor/ variabel  
independen



Variabel  
respon/Variabel  
dependen



Dapatkah variabel X memprediksi Y ?  
Adakah korelasi antara X dan Y?

**Analisis regresi digunakan untuk mengetahui bagaimana variabel dependen atau kriterium dapat diprediksikan melalui variabel independen atau prediktor secara individu atau parsial maupun secara bersama-sama atau simultan.**



# Misal..Ilustrasi hubungan positif antara x dan y

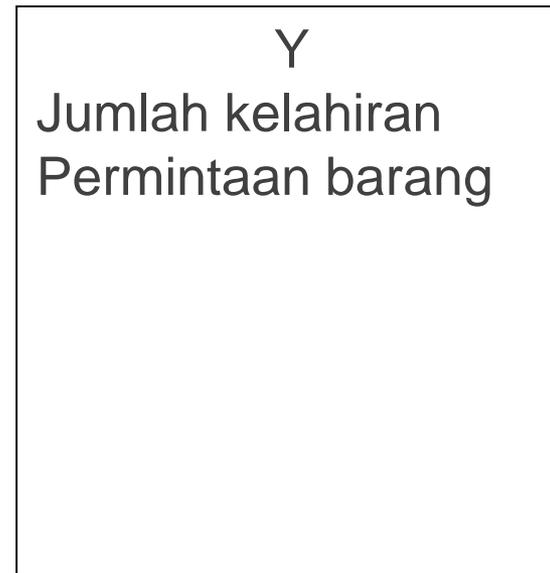
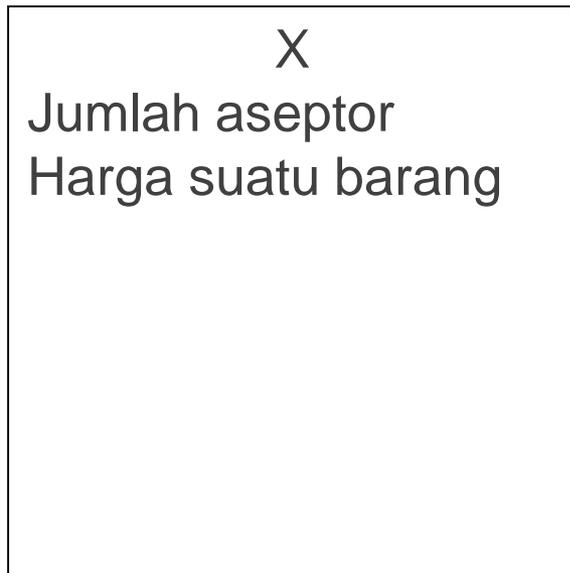
x  
Pupuk  
Berat Badan  
Keaktifan  
Kepemimpinan  
Kinerja



y  
Produksi  
Tekanan darah  
Prestasi  
softskill  
Produktifitas

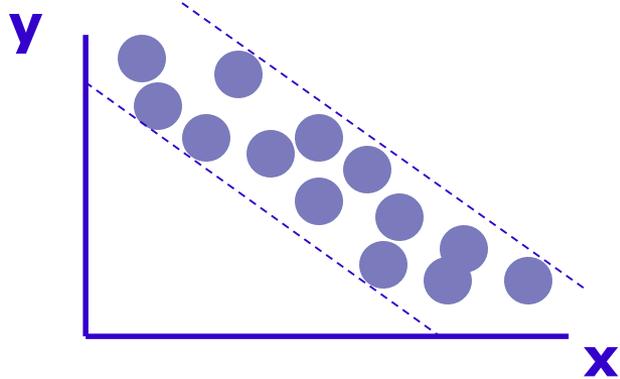
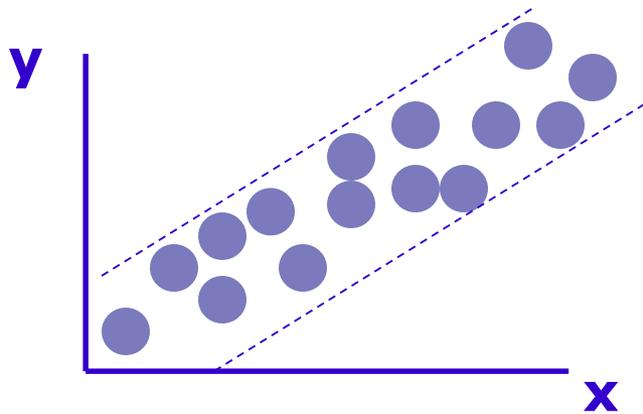


# Ilustrasi hubungan negatif

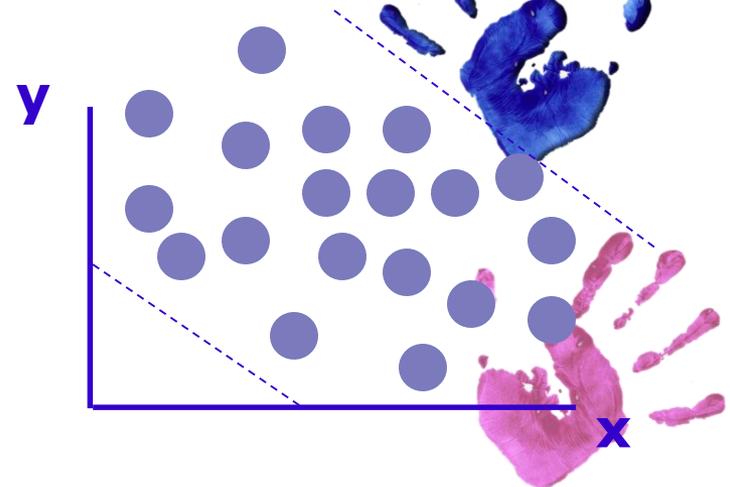
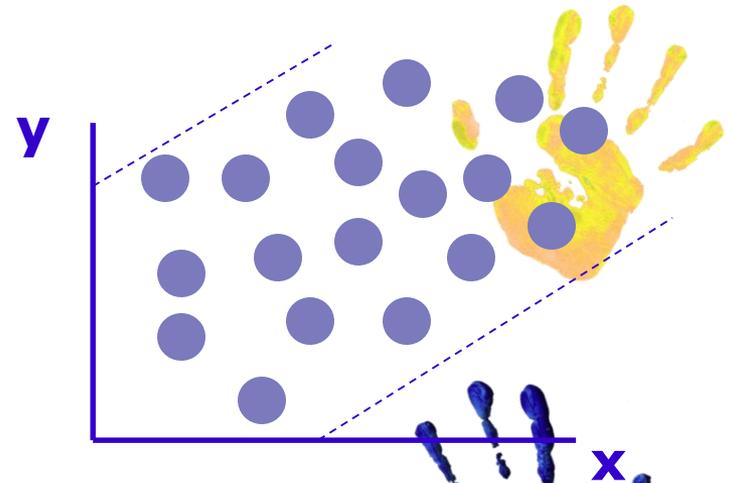


# Contoh plot korelasi

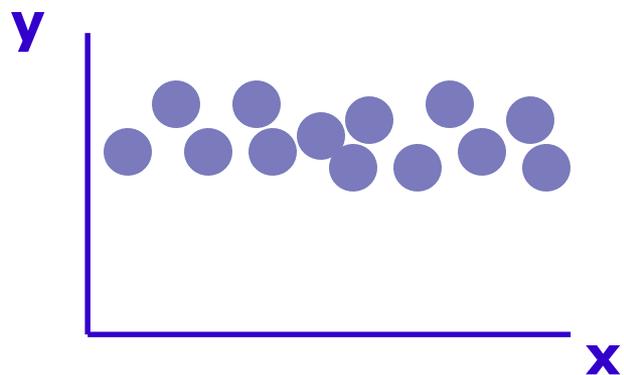
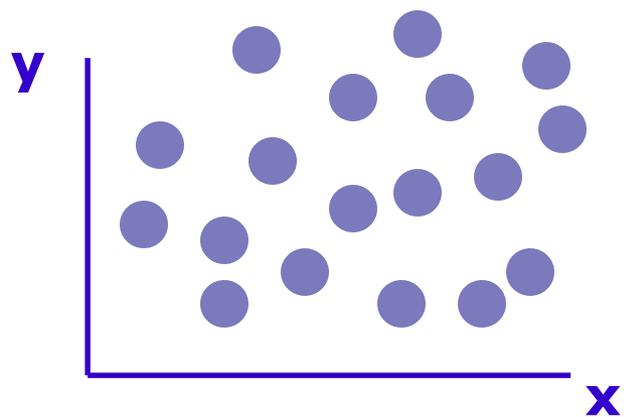
Hubungan kuat



Hubungan lemah



**Tidak ada hubungan**





## I. Regresi linier jika hubungan antara variabel bebas terhadap variabel tak bebas berbentuk linier

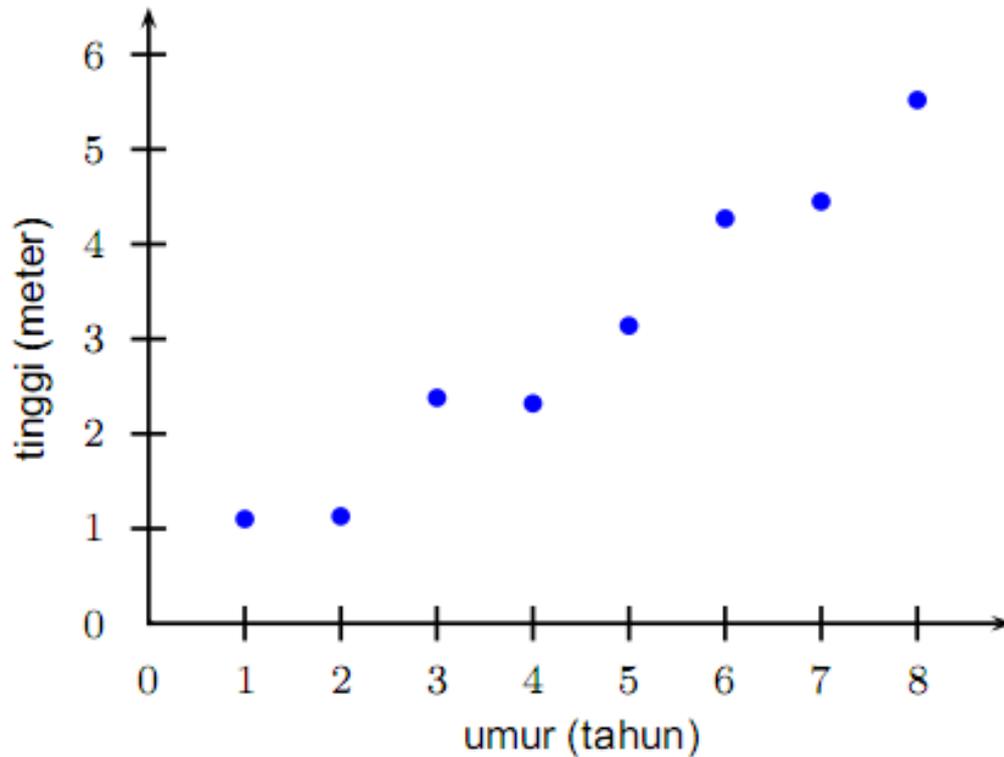
- ❑ Regresi linier sederhana  $\rightarrow \hat{Y} = a + bX$
- ❑ Regresi linier berganda  $\rightarrow \hat{Y} = a + b_1X_1 + b_2X_2 + b_3X_3$
- ❑ Regresi Logistik (Netter :555)
- ❑ Regresi Poisson

## II. Regresi tak linier jika hubungan antara variabel bebas terhadap variabel tak berbentuk linier

- ❑ Regresi Polinomial  $\rightarrow \hat{Y} = a + bX + cX^2$   
 $\hat{Y} = a + bX + cX^2 + dX^3$
- ❑ Neural Network Model (netter : 547)

# Regresi Linier Sederhana

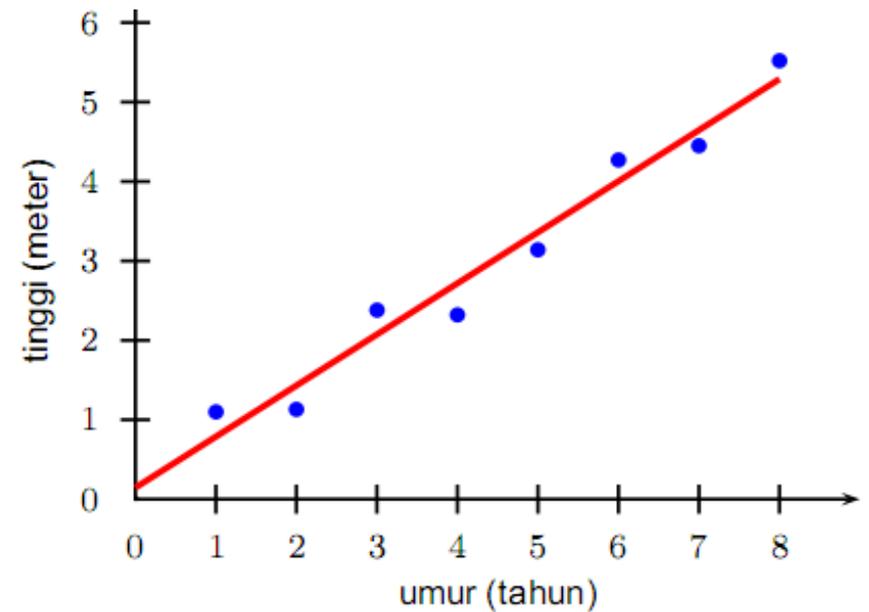
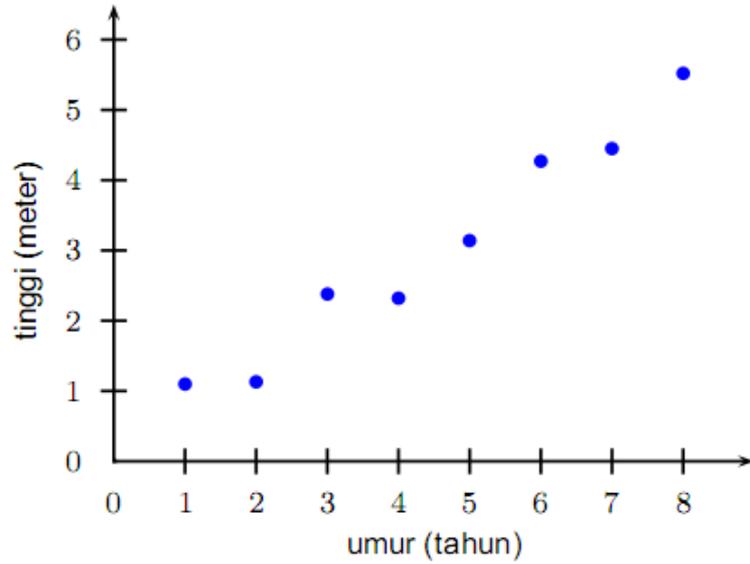
Akan dicari garis linear  $\hat{y} = a + bx$  yang paling "mewakili" hubungan antara  $x$  (umur) dan  $y$  (tinggi)



Dipunyai data umur dan tinggi dari sampel 8 buah pohon jenis tertentu

sbb.:

umur (tahun):	1	2	3	4	5	6	7	8
tinggi (meter):	1,10	1,13	2,38	2,32	3,14	4,27	4,45	5,52



# Memilih persamaan Terbaik ..?

- Metode Seleksi Maju
- Metode Penyisihan
- Metode Bertahap
- Metode R-square maksimum (MAXR)
- Metode PRESS

Sembiring, 1995



$X_i$  : variabel independen ke- $i$

$Y_i$  : variabel dependen ke- $i$  maka bentuk model regresi sederhana adalah :

$$Y_i = \alpha + \beta X_i + \varepsilon_i, \quad i = 1, 2, \dots, n$$

dengan

$\hat{\alpha}, \hat{\beta}$  atau  $a, b$  parameter yang tidak diketahui

$\varepsilon_i$  sesatan random dgn asumsi

NID  $(0, \sigma^2)$

$$E[\varepsilon_i] = 0, \text{Var}(\varepsilon_i) = \sigma^2$$

⇓

$\varepsilon_i$  dan  $\varepsilon_j$  tidak saling berkorelasi sehingga kovariansinya sama dengan 0,

$$\sigma\{\varepsilon_i, \varepsilon_j\} = 0, \forall i, j, i \neq j, i = 1, 2, \dots, n$$



$$Y_i = \alpha + \beta X_i + \varepsilon_i, \quad i = 1, 2, \dots, n$$

$$E[Y_i] = E[\alpha + \beta X_i + \varepsilon_i]$$

$$= \hat{\alpha} + \hat{\beta} X + E[\varepsilon_i]$$

So...

$$\hat{Y}_i = a + bX$$

$$Y_i = \alpha + \beta X_i + \varepsilon_i, \quad i = 1, 2, \dots, n$$

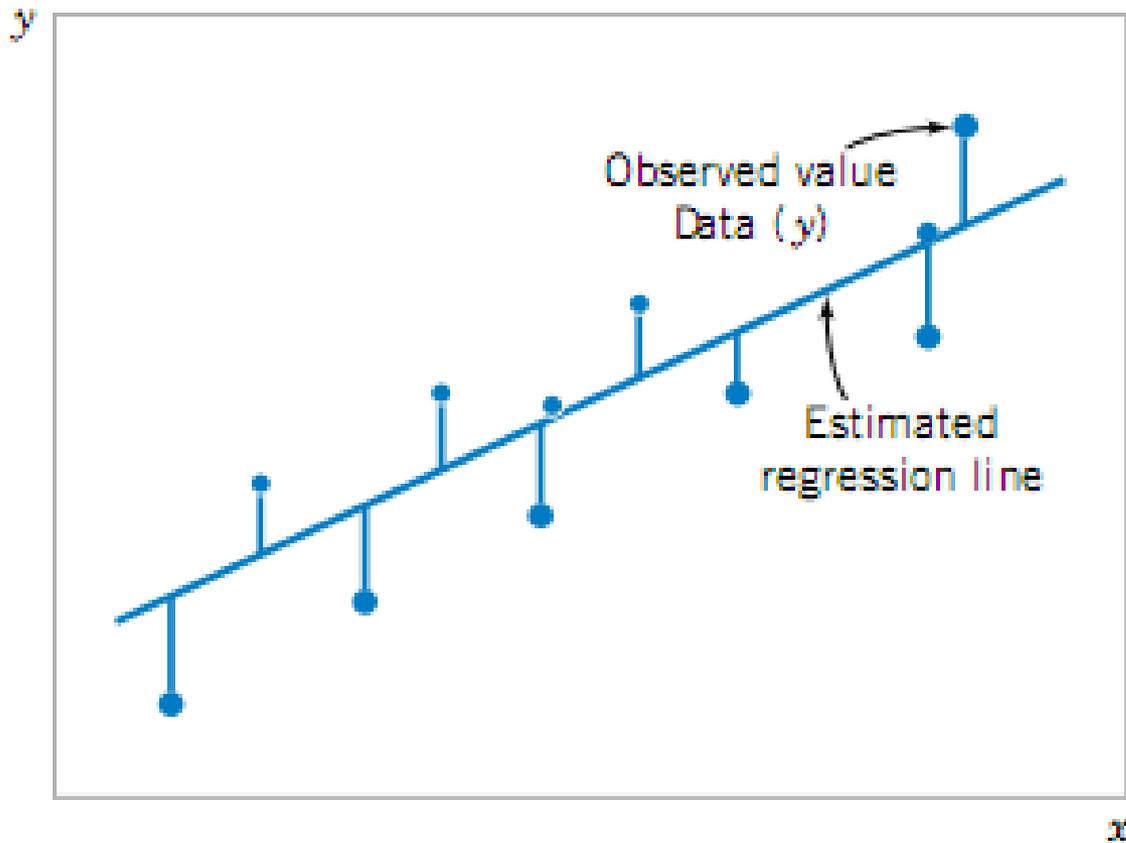
$$V(Y_i) = V(\alpha + \beta X_i + \varepsilon_i)$$

$$= V(\alpha + \beta X_i) + V(\varepsilon_i)$$

So...

$$V(Y_i) = 0 + \sigma^2$$





Dari garis regresi sampel diperoleh :

$$e_i = Y_i - (\hat{\alpha} + \hat{\beta} X_i)$$

$$\text{Dan } D = \sum_{i=1}^n e_i^2 = \sum_{i=1}^n (Y_i - (a + bX_i))^2$$

**Turunkan D  
terhadap  
a dan b !!!!**

$$\frac{\partial D}{\partial a} = -2 \sum_{i=1}^n (Y_i - a - bX_i) = 0$$

$$\sum_{i=1}^n Yi - an - b \sum_{i=1}^n X_i = 0$$

$$\sum_{i=1}^n Yi - b \sum_{i=1}^n X_i = an$$

$$a = \sum_{i=1}^n \frac{Yi}{n} - b \sum_{i=1}^n \frac{X_i}{n}$$
$$= \bar{Y} - b\bar{X}$$

$$\frac{\partial D}{\partial b} = -2 \sum_{i=1}^n (Y_i - a - bX_i) X_i = 0$$

$$\sum_{i=1}^n X_i Y_i - a \sum_{i=1}^n X_i - b \sum_{i=1}^n X_i^2 = 0$$

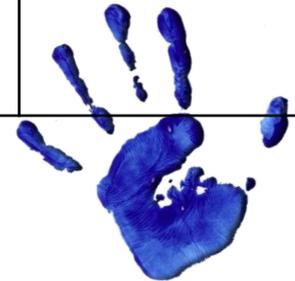
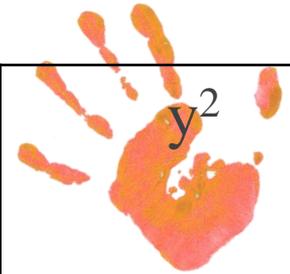
$$a = \frac{\sum y_i \sum x_i^2 - \sum x_i \sum x_i y_i}{n \sum x_i^2 - (\sum x_i)^2}$$

$$b = \frac{n \sum x_i y_i - \sum x_i \sum y_i}{n \sum x_i^2 - (\sum x_i)^2}$$



# ATAU

$y$	$x$	$xy$	$x^2$	$y^2$
.	.	.	.	.
.	.	.	.	.
$\Sigma y$	$\Sigma x$	$\Sigma xy$	$\Sigma x^2$	$\Sigma y^2$



$$b = \frac{n \sum xy - \sum x \sum y}{n \sum x^2 - (\sum x)^2}$$

$$a = \bar{y} - b\bar{x}$$

$$\bar{y} = \frac{\sum y}{n} \quad \bar{x} = \frac{\sum x}{n}$$

**Latihan** Carilah persamaan regresi Y pada X dari data Tabel :

Mat (X)	Fis (Y)	XY	X <sup>2</sup>	Y <sup>2</sup>
60	80	4800	3600	6400
45	69	3105	2025	4761
50	71	3550	2500	5041
60	85	5100	3600	7225
50	80	4000	2500	6400
65	82	5330	4225	6724
60	89	5340	3600	7921
65	93	6045	4225	8649
50	76	3800	2500	5776
65	86	5590	4225	7396
45	71	3195	2025	5041
50	69	3450	2500	4761
665	951	53305	37525	76095

$$a = \bar{y} - b_1 \bar{x} = 29.53$$

jadi diperoleh persamaan regresi:

$$\hat{Y}_i = 29.5294 + 0.8972 X_i$$

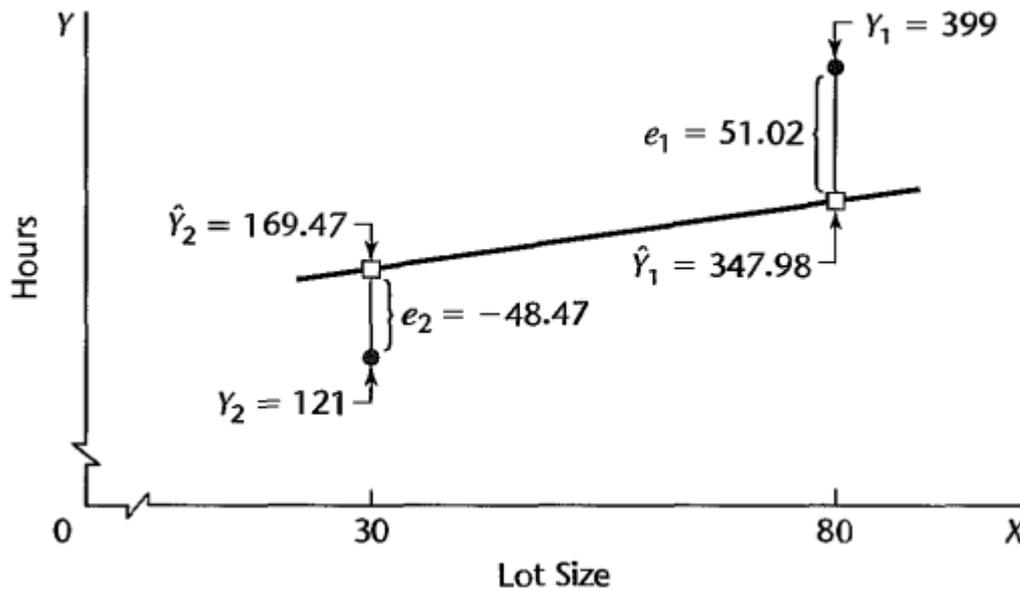
$$\begin{aligned} b &= \frac{\sum xy - \frac{(\sum x)(\sum y)}{n}}{\sum x^2 - \frac{(\sum x)^2}{n}} \\ &= \frac{53305 - \frac{(665)(951)}{12}}{37525 - \frac{(665)^2}{12}} \\ &= 0.8972 \end{aligned}$$



# Residual

- Merupakan nilai selisih antara  $Y_i$  dengan prediksi  $\hat{Y}_i$ , dinotasikan dengan  $e_i$ ,

Contoh ilustrasi



# Sifat residual

1.  $\sum_{i=1}^n e_i = 0$

2.  $\sum_{i=1}^n e_i^2$  minimum

3.  $\sum_{i=1}^n Y_i = \sum_{i=1}^n \hat{Y}_i$

4.  $\sum_{i=1}^n X_i e_i = 0$

5.  $\sum_{i=1}^n \hat{Y}_i e_i = 0$

6. garis regresi selalu melewati titik  $(\bar{X}, \bar{Y})$

Type equation here.



# Latihan



**Airfreight breakage.** A substance used in biological and medical research is shipped by airfreight to users in cartons of 1,000 ampules. The data below, involving 10 shipments, were collected on the number of times the carton was transferred from one aircraft to another over the shipment route ( $X$ ) and the number of ampules found to be broken upon arrival ( $Y$ ). Assume that first-order regression model (1.1) is appropriate.

$i$ :	1	2	3	4	5	6	7	8	9	10
$X_i$ :	1	0	2	0	3	1	0	1	2	0
$Y_i$ :	16	9	17	12	22	13	8	15	19	11

- Obtain the estimated regression function. Plot the estimated regression function and the data. Does a linear regression function appear to give a good fit here?
- Obtain a point estimate of the expected number of broken ampules when  $X = 1$  transfer is made.
- Estimate the increase in the expected number of ampules broken when there are 2 transfers as compared to 1 transfer.
- Verify that your fitted regression line goes through the point  $(\bar{X}, \bar{Y})$ .