



Inferensi dalam Analisis Regresi dan Korelasi

MENGUJI KOEFISIEN REGRESI DENGAN ANALISIS VARIANSI

Perhatikan

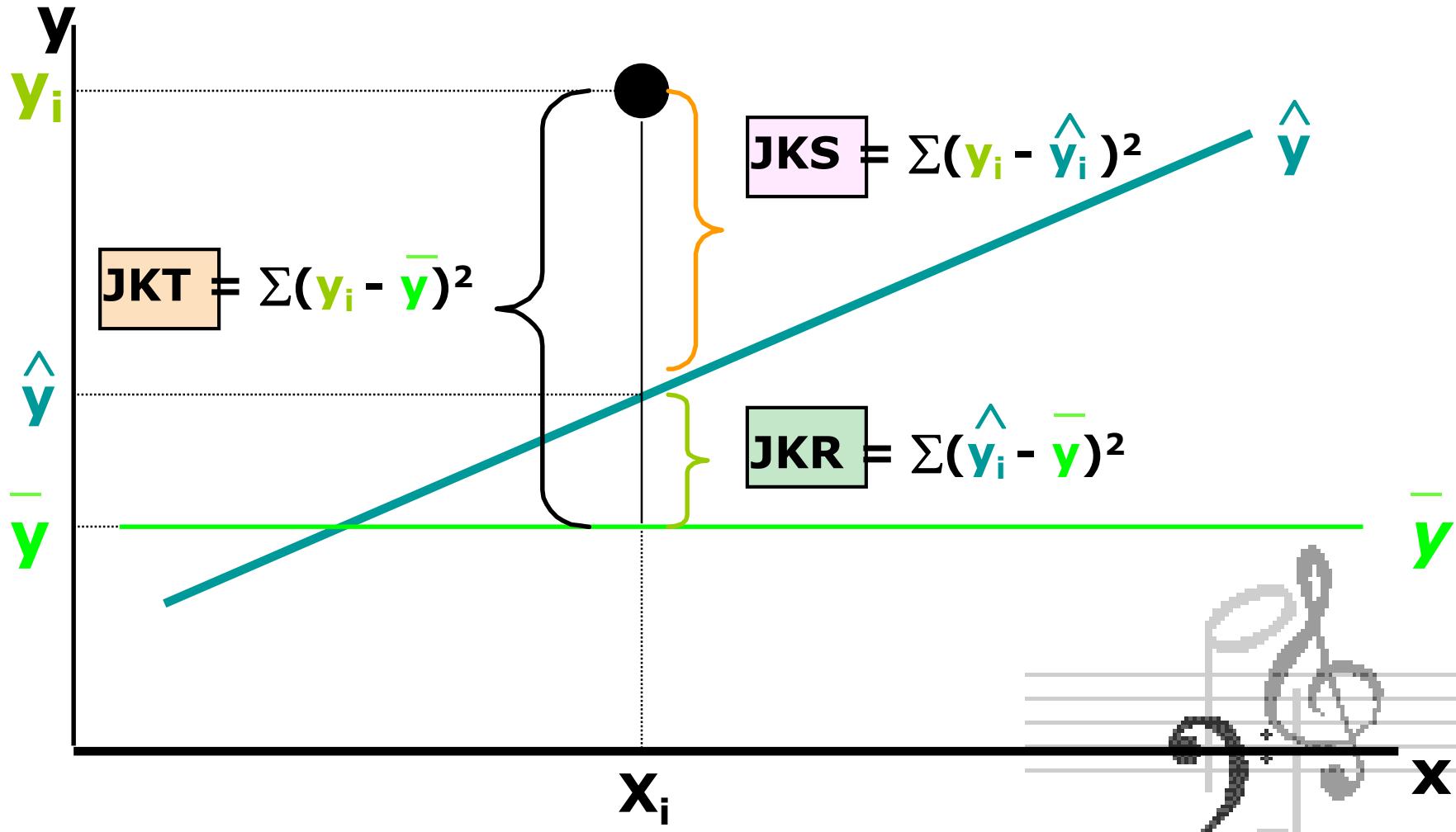
$$\begin{matrix} (y_i - \bar{y}) \\ \text{Total} \end{matrix} = \begin{matrix} (\hat{y}_i - \bar{y}) \\ \text{regresi} \end{matrix} + \begin{matrix} (y_i - \hat{y}_i) \\ \text{sisa} \end{matrix}$$

$$\underbrace{\sum_{i=1}^n (y_i - \bar{y})^2}_{JK_T} = \underbrace{\sum_{i=1}^n (\hat{y}_i - \bar{y})^2}_{JK_R} + 2 \underbrace{\sum_{i=1}^n (\hat{y}_i - \bar{y})(y_i - \hat{y}_i)}_{=0 \text{ (buktikan !!!)}} + \underbrace{\sum_{i=1}^n (y_i - \hat{y}_i)^2}_{JK_S}$$

Tentukan JKT dan JKR !



Variasi yang diterangkan dan Yang tidak dapat diterangkan



Contoh, utk model

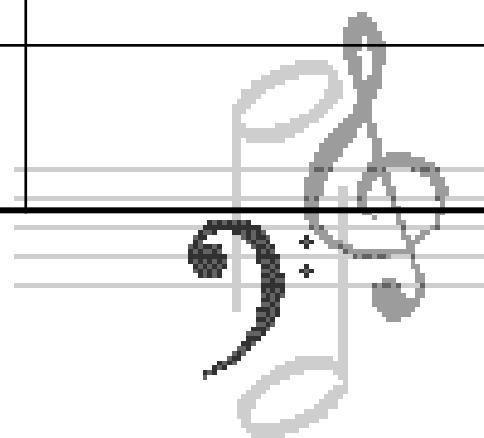
$$Y_i = \beta_0 + \beta_1 X_i + \varepsilon_i$$

- i. $H_0 : \beta_1 = 0$
- $H_1 : \beta_1 \neq 0$
- ii. Tingkat signifikansi 5%
- iii. Tabel ANAVA

| Sumber Variasi | JK | dk | RK | F0 |
|----------------|---|-----|--------------------------|------------------------------------|
| Regresi | JKR= $b^2 \sum_{i=1}^n (x_i - \bar{x})^2$ | 1 | RKR $=JKR/1$ | $F=RKR/RKS$ |
| Sesatan | JKS= JKT-JKR | n-2 | RKS $=JKS/n-2$ | F_{tabel} $F(\alpha, 1, n-2)$ |
| Total | JKT= $\sum_{i=1}^n y_i^2 - \frac{(\sum y_i)^2}{n}$ | n-1 | | |

DK. Tolak H_0 jika $F_0 > F_{tabel} = F_{\alpha, 1, n-2}$

Ada hubungan linier antara Mat dan Fis



Koefisien Determinasi, r^2

- Koefisien Determinasi adalah bagian dari variasi total dalam variabel dependen yang dijelaskan oleh variasi dalam variabel independen
- Disebut juga dengan **r-squared** dan dinotasikan dengan **r^2**

$$r^2 = \frac{JK_R}{JK_T} = \frac{\text{Jumlah kuadrat yang dijelaskan oleh regresi}}{\text{Jumlah kuadrat total}}$$

dengan

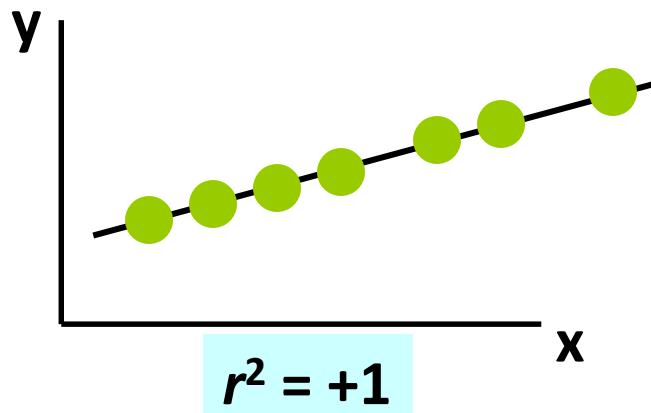
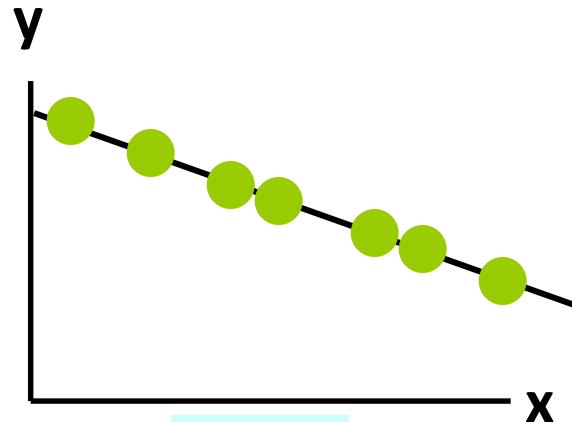
$$0 \leq r^2 \leq 1$$

$$r = \pm \sqrt{r^2}, \quad -1 \leq r \leq 1$$



r = Koefisien Korelasi

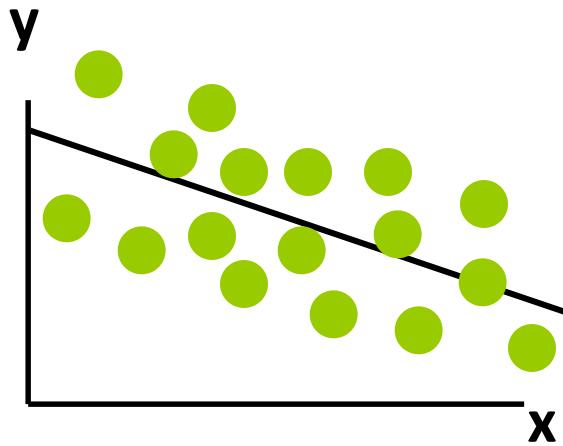
Gambaran nilai r^2



**Hubungan linier sempurna
antara x dan y :
100% variasi dalam y dijelaskan
oleh variasi dalam x**

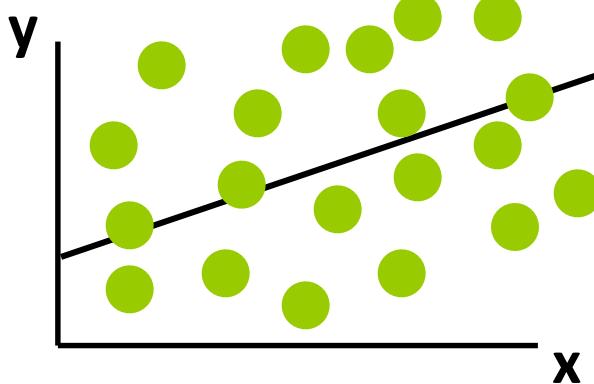


Gambaran nilai r^2

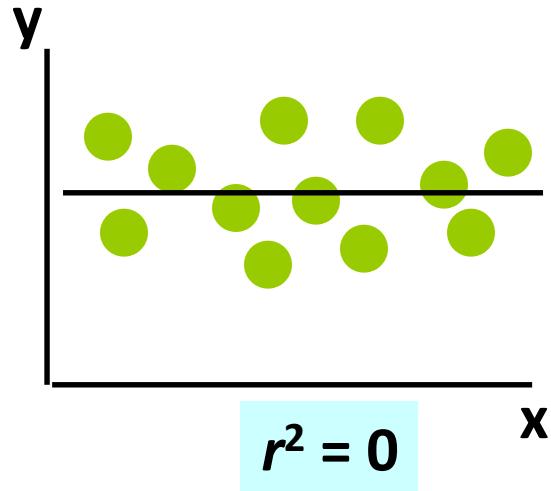


$$0 < r^2 < 1$$

Hubungan linier antara x dan y lemah :
Beberapa tapi tidak semua variasi y dijelaskan oleh variasi dalam x



Gambaran nilai r^2



$$r^2 = 0$$

Tidak ada hubungan linier
antara x dan y

Nilai Y tidak tergantung x



Contoh yang lalu

| Mat (X) | Fis (Y) | XY | X2 | Y2 |
|---------|---------|-------|-------|-------|
| 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 |

$$a = 29.529, \ b = 0.897$$

$$JK_R = b^2 \sum_{i=1}^n (x_i - \bar{x})^2 = 541.693$$

$$JK_T = \sum_{i=1}^n y_i^2 - \frac{(\sum y_i)^2}{n} = 728.25$$

$$JK_S = JK_T - JK_R = 728.25 - 541.693 = 186.557$$

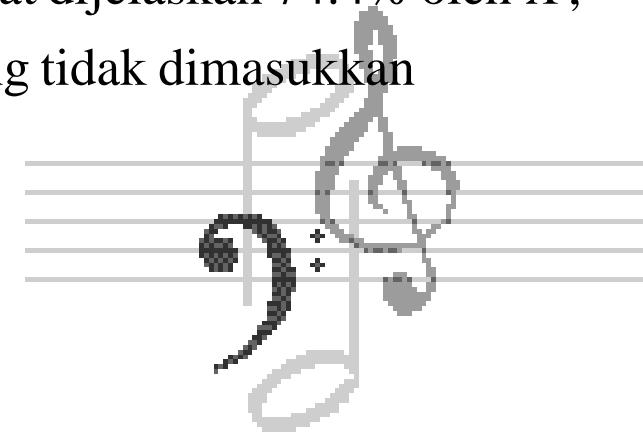
Jadi bisa kita hitung

$$r^2 = \frac{JK_R}{JK_T} = \frac{541.693}{728.25} = 0.743828$$

jadi persamaan regresi $\hat{Y}_i = 29.5294 + 0.8972X_i$, nilai Y dapat dijelaskan 74.4% oleh X, sedangkan sisanya 25.6% diterangkan oleh variabel lain yang tidak dimasukkan dalam model

Total variasi dalam Y diturunkan sebanyak 74,4% oleh X

$$r = \sqrt{0.744} = 0.863$$



Kesalahan Baku Taksiran

(Standard Error of Estimate)

- Merupakan ukuran variabilitas antara Y dengan nilai Y prediksi

$$s_{y.x} = \sqrt{\frac{JK_s}{n - 2}}$$

- Contoh yll:

$$JK_s = 186.557$$

$$s_{y.x} = \sqrt{\frac{186.557}{12 - 2}} = 4.319$$



Kesalahan Baku Koef. Regresi

definisi

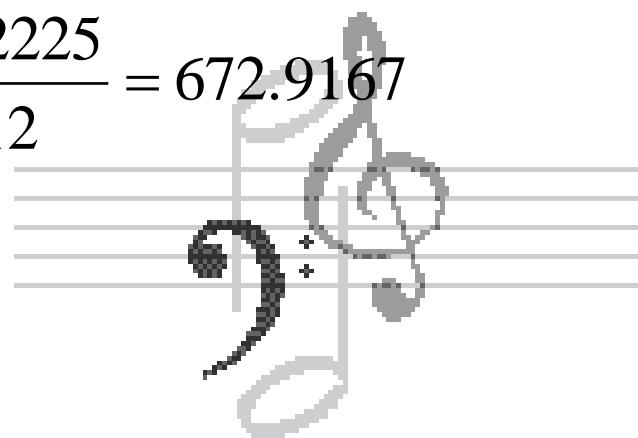
$$s_b = \sqrt{\frac{s_{y.x}^2}{c}}, \quad c = \sum x^2 - \frac{(\sum x)^2}{n}$$

Contoh yll

$$\sum x^2 = 37525, \quad (\sum x)^2 = (665)^2 = 442225$$

$$s_b = \sqrt{\frac{s_{y.x}^2}{c}}, \quad c = \sum x^2 - \frac{(\sum x)^2}{n} = 37525 - \frac{442225}{12} = 672.9167$$

$$s_b = \sqrt{\frac{s_{y.x}^2}{c}} = \sqrt{\frac{18.6557}{672.9167}} = 0.166504$$



Persyaratan pada uji regresi linier

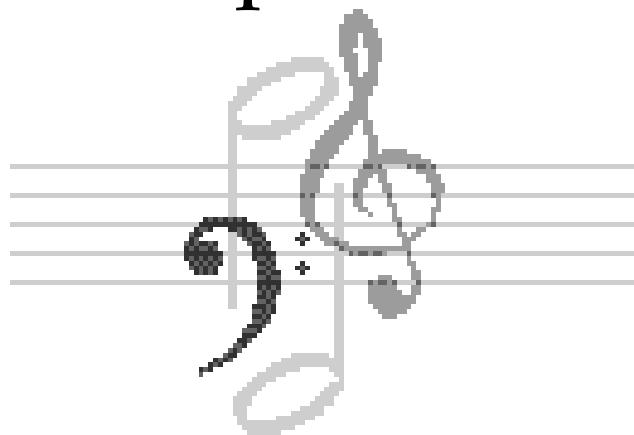
1. Normalitas
2. Linieritas dan Keberartian
3. Independensi
4. Homoskedastisitas



Uji linieritas

1. Susun hipotesis
2. Pilih tingkat signifikansi
3. Hitung anava
4. Kesimpulan :

Tolak H_0 jika $F_{obs} > F_{k-2, n-k, \alpha}$



Tabel ANAVA

| SV | JK | Db | RK | Fobs | Ftabel |
|--------------------|---------|-----|---------|----------------|-----------------|
| Regresi | JKR | 1 | | | |
| Sesatan Tuna Cocok | JK(STC) | k-2 | RK(STC) | RK(STC)/RK(SM) | Fk-2,n-k, alpha |
| Sesatan Murni | JK(SM) | n-k | RK(SM) | | |
| Total | JKT | n-1 | | | |

$$JK_{STC} = JK_S - JK_{SM}, \quad JK_{SM} = \sum_{i,j} Y_{ij}^2 - \sum_i \frac{T_i^2}{n_i}$$

T_i : jumlah Y yang bersesuaian dengan X



Contoh yll

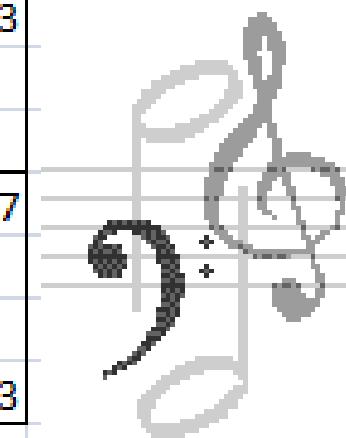
1. Susun Hipotesis :

H0: Hubungan X dan Y linier

H1: Hubungan X dan Y tidak linier

2. Alpha =0.05

| Kelompok | X | Y | Y^2 | n | Ti | Ti^2/ni |
|----------|-----|-----|-------|---|-----|----------|
| 1 | 45 | 69 | 4761 | 2 | 140 | 9800 |
| | 45 | 71 | 5041 | | | |
| 2 | 50 | 71 | 5041 | 4 | 296 | 21904 |
| | 50 | 80 | 6400 | | | |
| | 50 | 76 | 5776 | | | |
| | 50 | 69 | 4761 | | | |
| 3 | 60 | 80 | 6400 | 3 | 254 | 21505.33 |
| | 60 | 85 | 7225 | | | |
| | 60 | 89 | 7921 | | | |
| 4 | 65 | 82 | 6724 | 3 | 261 | 22707 |
| | 65 | 93 | 8649 | | | |
| | 65 | 86 | 7396 | | | |
| | 665 | 951 | 76095 | | | 75916.33 |



| Kelompok | X | Y | Y^2 | n | Ti | Ti^2/ni |
|----------|-----|-----|-------|---|-----|----------|
| 1 | 45 | 69 | 4761 | 2 | 140 | 9800 |
| | 45 | 71 | 5041 | | | |
| 2 | 50 | 71 | 5041 | 4 | 296 | 21904 |
| | 50 | 80 | 6400 | | | |
| | 50 | 76 | 5776 | | | |
| | 50 | 69 | 4761 | | | |
| 3 | 60 | 80 | 6400 | 3 | 254 | 21505.33 |
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| | 60 | 89 | 7921 | | | |
| 4 | 65 | 82 | 6724 | 3 | 261 | 22707 |
| | 65 | 93 | 8649 | | | |
| | 65 | 86 | 7396 | | | |
| | 665 | 951 | 76095 | | | 75916.33 |

$$JK_R = 541.693$$

$$JK_T = 728.25$$

$$JK_S = 186.557$$

$$JK_{SM} = \sum_{i,j} Y_{ij}^2 - \sum_i \frac{T_i^2}{n_i} = 76095 - 75916.33 = 178.6667$$

$$JK_{STC} = JK_S - JK_{SM} = 186.557 - 178.6667 = 7.890333$$

T_i : jumlah Y yang bersesuaian dengan X



3. Tabel ANAVA

| SV | JK | Db | RK | Fobs | Ftabel |
|--------------------|----------|---------|----------|----------|--------------------|
| Regresi | 541.693 | 1 | | | |
| Sesatan Tuna Cocok | 7.890333 | 4-2=2 | 3.945167 | 0.176652 | $F(2,8,0.05)=4.46$ |
| Sesatan Murni | 178.6667 | 12-4=8 | 22.3333 | | |
| Total | 728.25 | 12-1=11 | | | |

4. Kesimpulan :

H_0 tidak ditolak, karena $F_{obs}=0.176652 < F_{tabel}=4.46$
d.k.l hubungan X dan Y linier



Uji Keberartian Regresi

1. Susun hipotesis

H_0 : Hubungan linier X dan Y tidak berarti

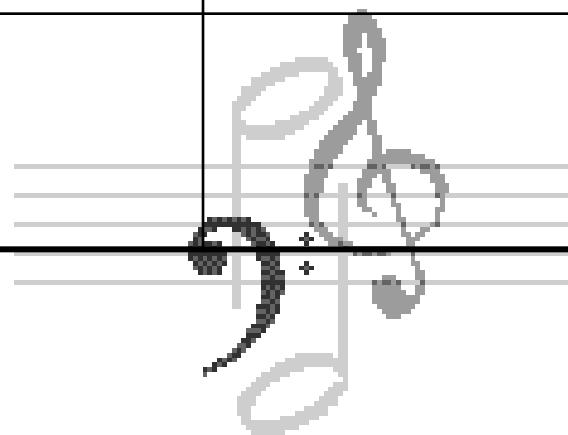
H_1 : Hubungan linier X dan Y berarti

2. Pilih tingkat signifikansi
3. Susun Anava
4. Kesimpulan : tolah H_0 jika $F > F_{tabel}$



Tabel Anava :

| Sumber Variasi | JK | dk | RK | F Hitung |
|----------------|---|---------|---------------------|--------------------------------------|
| Regresi | $JKR = b^2 \sum_{i=1}^n (x_i - \bar{x})^2$ | 1 | $RKR = JKR / 1$ | $F = RKR / RKS$ |
| Sesatan | $JKS = JKT - JKR$ | $n - 2$ | $RKS = JKS / n - 2$ | F_{tabel} $F(\alpha, 1, n - 2)$ |
| Total | $JKT = \sum_{i=1}^n y_i^2 - \frac{(\sum y_i)^2}{n}$ | $n - 1$ | | |



Contoh Yll

1. Susun hipotesis

H_0 : Hubungan linier X dan Y tidak berarti

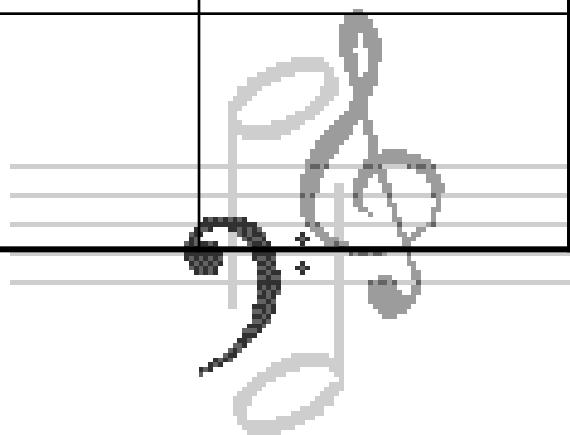
H_1 : Hubungan linier X dan Y berarti

2. Pilih tingkat signifikansi =0.05
3. Susun Anava
4. Kesimpulan : tolak H_0 jika $F > F$ tabel



Tabel Anava :

| Sumber Variasi | JK | dk | RK | F Hitung |
|----------------|---------|---------|---------|------------------------------------|
| Regresi | 541.193 | 1 | 541.193 | 29.04 |
| Sesatan | 186.557 | 12-2=10 | 18.6557 | F_{tabel} $F(\alpha, 1, n-2)$ |
| Total | 728.25 | 12-1=11 | | |



4. Kesimpulan :

Tolak H_0 karena

$F_{obs} = 29.04 > F_{tabel} = 4.96$

d.k.l regresi linier X dan Y berarti



Uji Keberartian Koef. Regresi

1. Susun hipotesis

$$H_0 : \beta = 0$$

$$H_1 : \beta \neq 0$$

2. Pilih tingkat signifikansi

3. Kesimpulan : tolak H_0 jika $t > t_{\text{tabel}}$

$$t = \frac{b}{s_b}$$



Contoh Yll

1. Susun hipotesis

$$H_0 : \beta = 0$$

$$H_1 : \beta \neq 0$$

2. Pilih tingkat signifikansi α

3. Kesimpulan : tolak H_0 jika $t > t_{\text{tabel}} = t(\alpha/2, n-2)$

$$b = 0.8972$$

$$s_b = 0.166504$$

$$t = \frac{0.8972}{0.166504} = 5.388$$

Karena $t=5.388 > 2.228$ maka H_0 ditolak jadi koefisien b berarti. 2.228 diperoleh dari tabel t dengan $t(0.025, 10)$



Model Summary

| Model | R | R Square | Adjusted R Square | Std. Error of the Estimate |
|-------|-------------------|----------|-------------------|----------------------------|
| 1 | .862 ^a | .744 | .718 | 4.319 |

a. Predictors: (Constant), matematik

ANOVA^b

| Model | | Sum of Squares | df | Mean Square | F | Sig. |
|-------|------------|----------------|----|-------------|--------|-------------------|
| 1 | Regression | 541.693 | 1 | 541.693 | 29.036 | .000 ^a |
| | Residual | 186.557 | 10 | 18.656 | | |
| | Total | 728.250 | 11 | | | |

a. Predictors: (Constant), matematik

b. Dependent Variable: fisika

Coefficients^a

| Model | Unstandardized Coefficients | | Beta | t | Sig. | Collinearity Statistics | |
|-------|-----------------------------|------------|-------|-------|------|-------------------------|-------|
| | B | Std. Error | | | | Tolerance | VIF |
| 1 | (Constant) | 29.529 | 9.311 | 3.171 | .010 | 1.000 | 1.000 |
| | matematik | .897 | .167 | | | | |

a. Dependent Variable: fisika