

↗ matriz de designo

$$\mathbf{y}_{n \times 1} = \mathbf{X}_{n \times k} \beta_{k \times 1} + \epsilon_{n \times 1} = \mathbf{X}_{n \times (p+1)} \beta_{(p+1) \times 1} + \epsilon_{n \times 1}$$

$$\underbrace{\begin{pmatrix} y_1 \\ y_2 \\ \vdots \\ y_n \end{pmatrix}}_{n \times 1} = \underbrace{\begin{pmatrix} 1 & x_{11} & x_{21} & \dots & x_{p1} \\ 1 & x_{12} & x_{22} & \dots & x_{p2} \\ \vdots & \vdots & \vdots & & \vdots \\ 1 & x_{1n} & x_{2n} & \dots & x_{pn} \end{pmatrix}}_{n \times k} \times \underbrace{\begin{pmatrix} \beta_0 \\ \beta_1 \\ \vdots \\ \beta_p \end{pmatrix}}_{k \times 1} + \underbrace{\begin{pmatrix} \epsilon_1 \\ \epsilon_2 \\ \vdots \\ \epsilon_n \end{pmatrix}}_{n \times 1}$$

? ?

(Intercept)

64.557707

IMC

3.095683

(Intercept)

110.47710380

Edad Minutos_ejercicio

0.45472167

-0.08487366

IMC

0.27956285

$x_1 + 1$

$$\hat{y} = \hat{\beta}_0 + \hat{\beta}_1 x_1 + \hat{\beta}_2 x_2 + \hat{\beta}_3 x_3$$
$$\hat{y}^* = \hat{\beta}_0 + \hat{\beta}_1 (x_1 + 1) + \hat{\beta}_2 x_2 + \hat{\beta}_3 x_3$$

$$\hat{y}^* - \hat{y} = \hat{\beta}_1$$

Ejemplo $H_0 : \beta_1 = \beta_2 = \beta_3 = 0$ $H_1 : \text{Al menos un } \beta_j \neq 0$ $\alpha = 0.05$

```
X = cbind(1,datos$Edad, datos$Minutos_ejercicio, datos$IMC)
modelo2_ = lm(Presion_sistolica ~ X, datos)
modelo2_ |> aov() |> summary()
```

	Df	Sum Sq	Mean Sq	F value	Pr(>F)
X	3	11282	3761	76.65	<2e-16 ***
Residuals	96	4710	49		

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

$GL_{Total} = 99$
 $GL_{Reg} = 3$
 $GL_{Error} = 96$
 $SC_{Total} = SC_{Reg} + SCE$
 $= 11282 + 4710 = 15992$

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
X_1 (Intercept)	110.477104	8.598105	12.849	< 2e-16	***
Edad	0.454722	0.052810	8.610	1.43e-13	***
Minutos_ejercicio	-0.084874	0.009152	-9.274	5.41e-15	***
X_3 IMC	0.279563	0.421363	0.663	0.509	

$$\hat{y} = \beta_0 + \underbrace{\beta_1 X_1 + \dots}_{\checkmark} + \underbrace{\beta_3 X_3}_{\text{no es signif.}}$$

X_1 es signif.
 X_1 contribuye signif.

X_3 no contribuye signif.

$H_0: \beta_1 = 0$ ✗
 $H_1: \beta_1 \neq 0$ ✓
 $\alpha = 0.05$
 $pV = 1.43 \times 10^{-13}$
 $pV < \alpha$
 \Downarrow
 Rech. H_0
 \Downarrow
 $\beta_1 \neq 0$

$H_0: \beta_3 = 0$ ✓
 $H_1: \beta_3 \neq 0$
 $\alpha = 0.05$
 $pV = 0.509$
 $pV > \alpha$
 \Downarrow
 No Rech. H_0
 \Downarrow
 $\beta_3 = 0$

$$Y = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \beta_3 x_3 + \beta_4 x_4$$

Ejm

$$Y \sim x_1 + x_2$$

R^2
70%

R^2_{aj}
69%

parsimonia

(x_3 si aporta) $Y \sim x_1 + x_2 + x_3$

75%

73%

(x_4 no aporta) $Y \sim x_1 + x_2 + x_3 + x_4$

77%

72%

$$AIC = -2\log(L) + 2r$$

+ parámetros $\Rightarrow \log(L) \uparrow$

$-2\log(L) \downarrow$
pero $2r \uparrow$

$$VIF_j = \frac{1}{1 - R_j^2}$$

Por ejm: $y \sim X_1 + X_2 + X_3 + X_4$

$$VIF_1 = \frac{1}{1 - R_1^2}, \quad R_1^2 \rightarrow R^2 \text{ del modelo } X_1 \sim X_2 + X_3 + X_4$$

$$R_1^2 = 0.93$$

$$VIF_1 = \frac{1}{1 - 0.93} = \frac{1}{0.07} = 14.3$$

$$VIF_2 = \frac{1}{1 - R_2^2}, \quad R_2^2 \rightarrow R^2 \text{ del modelo } X_2 \sim X_1 + X_3 + X_4$$

$$R_2^2 = 0.10$$

$$VIF_2 = \frac{1}{1 - 0.10} = \frac{1}{0.90} = 1.11$$


$VIF \uparrow$ Multicol \uparrow
 $VIF = 1$ Multicol \downarrow

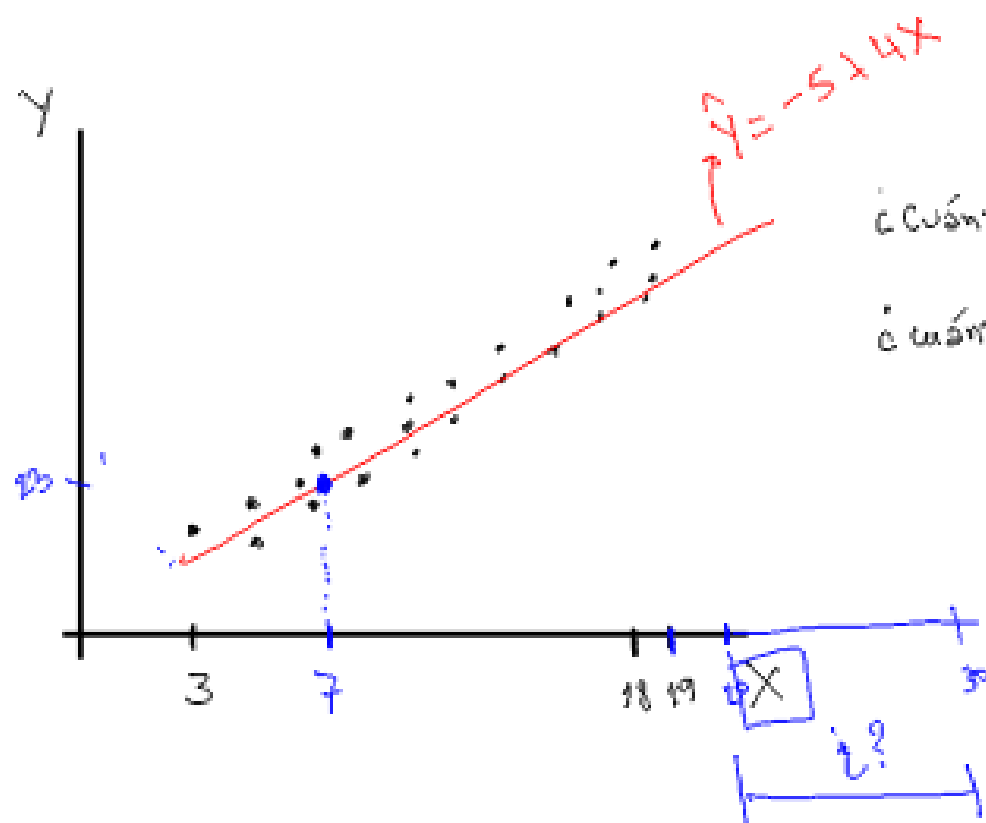
```
> # ESTIMACIÓN INTERVALAR DE LA MEDIA
> modelo2 |>
+   predict(data.frame(Edad = 30,
+                       Minutos_ejercicio = 60,
+                       IMC = 23),
+           interval = "confidence",
+           level = 0.90)
      fit      lwr      upr
1 125.4563 122.1979 128.7147
```

$$IC(\mu \mid E_{d=30}, E_j=60, IMC=23) = (122.2, 128.7)$$

```
> # PREDICCIÓN INTERVALAR DE Y
> modelo2 |>
+   predict(data.frame(Edad = 30,
+                       Minutos_ejercicio = 60,
+                       IMC = 23),
+           interval = "prediction",
+           level = 0.90)
      fit      lwr      upr
1 125.4563 113.3747 137.5378
```

$$IP(y \mid E_{d=30}, E_j=60, IMC=23) = (113.4, 137.5)$$


más ancho



¿Cuánto vale \hat{y} cuando $x = 7$? • → 23

¿cuánto vale \hat{y} cuando $x = 30$? $-5 + 4(30) = 115$
(extrapolación)