

# Clase 4.0

## Análisis

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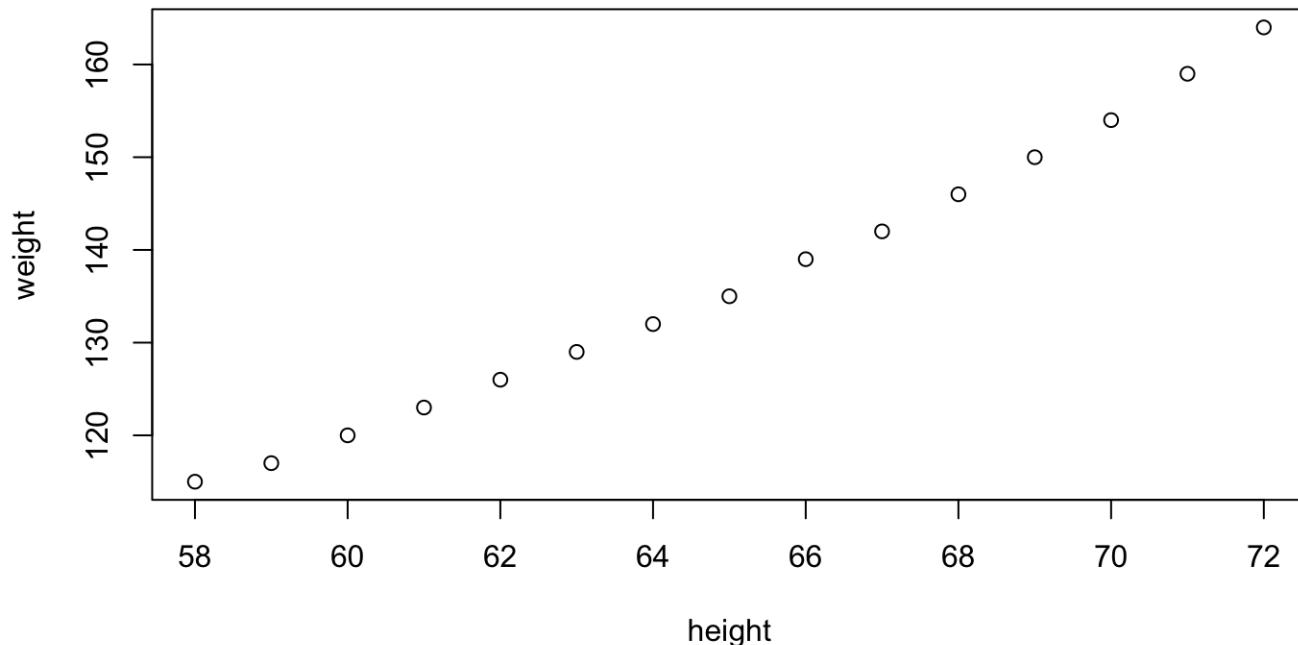
Estadística y Manejo de Datos con R (EMDR) — Virtual

# Modelos

# Modelos

- Regresión sencilla, una relación de una variable predictora y una variable de respuesta.

```
plot(women)
```



```
lm(weight ~ height, data = women)
```

```
##  
## Call:  
## lm(formula = weight ~ height, data = women)
```

# Modelos

- Detalles de la regresión.

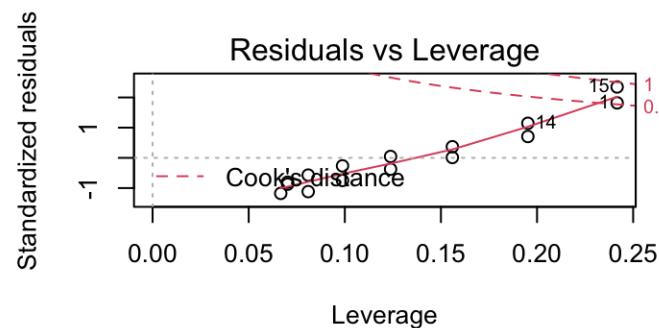
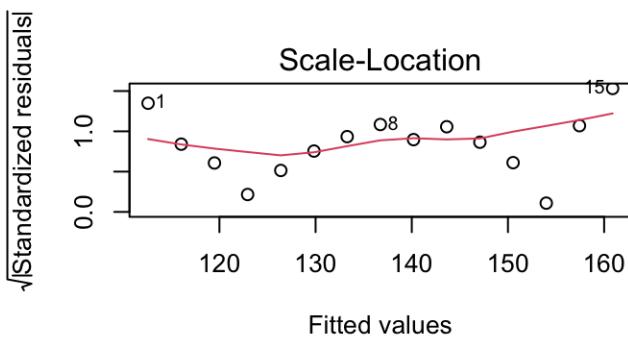
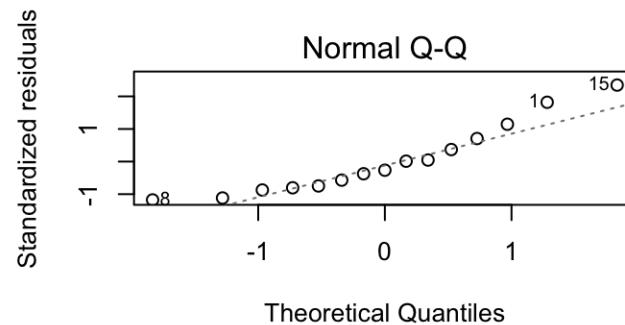
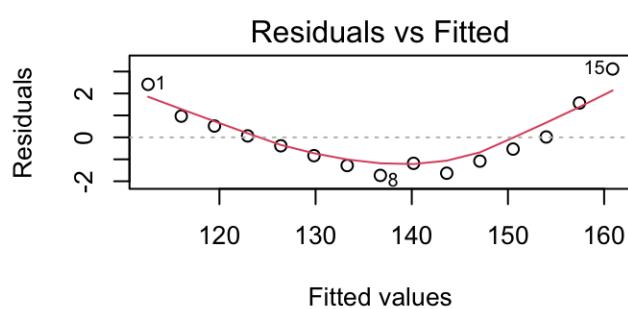
```
m1 <- lm(weight ~ height, data = women)
summary(m1)
```

```
##
## Call:
## lm(formula = weight ~ height, data = women)
##
## Residuals:
##     Min      1Q  Median      3Q     Max 
## -1.7333 -1.1333 -0.3833  0.7417  3.1167 
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept) -87.51667   5.93694 -14.74 1.71e-09 ***
## height       3.45000   0.09114  37.85 1.09e-14 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 1.525 on 13 degrees of freedom
## Multiple R-squared:  0.991, Adjusted R-squared:  0.9903 
## F-statistic: 1433 on 1 and 13 DF,  p-value: 1.091e-14
```

# Modelos

- Residuales ¿son homoscedásticos?

```
par(mfrow = c(2, 2))
plot(m1)
```



# Modelos



# Modelos

- Regresión múltiple, la relación de más de una variable predictora y una variable de respuesta.

```
movies <- read.table("movies.csv", sep = ",", header = T)
head(movies)
```

```
##   Ganancias CostoProd CostoPromo LibrosVendidos
## 1      85.1      8.5    5.100000        4.7
## 2     106.3     12.9    5.800000        8.8
## 3      50.2      5.2    2.100000       15.1
## 4     130.6     10.7    8.399999       12.2
## 5      54.8      3.1    2.900000       10.6
## 6      30.3      3.5    1.200000        3.5
```

# Nota: obtén el conjunto de datos "movies.csv" dando click en el  
# botón "Descarga" que antecede al recuadro de este tema

# Modelos

- 1 variable predictora.

```
lm.mov1 <- lm(Ganancias ~ CostoProd, data = movies)
summary(lm.mov1)
```

```
##
## Call:
## lm(formula = Ganancias ~ CostoProd, data = movies)
##
## Residuals:
##     Min      1Q  Median      3Q     Max 
## -13.136  -9.029  -3.689   3.208  29.723 
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept) 15.513     11.603   1.337  0.217989    
## CostoProd    7.978      1.223   6.522 0.000184 ***  
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 14.26 on 8 degrees of freedom
## Multiple R-squared:  0.8417, Adjusted R-squared:  0.8219 
## F-statistic: 42.54 on 1 and 8 DF,  p-value: 0.0001838
```

# Modelos

- 2 variables predictoras.

```
lm.mov2 <- lm(Ganancias ~ CostoProd + CostoPromo, data = movies)
summary(lm.mov2)
```

```
##
## Call:
## lm(formula = Ganancias ~ CostoProd + CostoPromo, data = movies)
##
## Residuals:
##      Min        1Q    Median        3Q       Max
## -15.4168   -2.5696    0.8052    2.1200   11.0463
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t| )
## (Intercept) 11.848     6.765   1.751  0.12334
## CostoProd    4.228     1.153   3.667  0.00800 **
## CostoPromo   7.436     1.806   4.117  0.00448 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 8.241 on 7 degrees of freedom
## Multiple R-squared:  0.9537, Adjusted R-squared:  0.9405
## F-statistic: 72.14 on 2 and 7 DF,  p-value: 2.131e-05
```

# Modelos

- 3 variables predictoras.

```
lm.mov3 <- lm(Ganancias ~ CostoProd + CostoPromo + LibrosVendidos, data = movies)
summary(lm.mov3)
```

```
##
## Call:
## lm(formula = Ganancias ~ CostoProd + CostoPromo + LibrosVendidos,
##      data = movies)
##
## Residuals:
##       Min     1Q   Median     3Q    Max 
## -12.4384 -3.1695  0.8499  3.5134  9.6207 
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept) 7.6760    6.7602   1.135   0.2995    
## CostoProd   3.6616    1.1178   3.276   0.0169 *  
## CostoPromo  7.6211    1.6573   4.598   0.0037 ** 
## LibrosVendidos 0.8285    0.5394   1.536   0.1754    
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 7.541 on 6 degrees of freedom
## Multiple R-squared:  0.9668, Adjusted R-squared:  0.9502 
## F-statistic: 58.22 on 3 and 6 DF,  p-value: 7.913e-05
```

# Modelos

- Comparando el modelo 1 contra modelo 2.

```
anova(lm.mov1, lm.mov2)
```

```
## Analysis of Variance Table
##
## Model 1: Ganancias ~ CostoProd
## Model 2: Ganancias ~ CostoProd + CostoPromo
##   Res.Df   RSS Df Sum of Sq    F    Pr(>F)
## 1     8 1626.27
## 2     7  475.37  1    1150.9 16.947 0.004478 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

# Modelos

- Comparando el modelo 2 contra modelo 3.

```
anova(lm.mov2, lm.mov3)
```

```
## Analysis of Variance Table
##
## Model 1: Ganancias ~ CostoProd + CostoPromo
## Model 2: Ganancias ~ CostoProd + CostoPromo + LibrosVendidos
##   Res.Df   RSS Df Sum of Sq    F Pr(>F)
## 1      7 475.37
## 2      6 341.20  1    134.17 2.3594 0.1754
```

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