#### **CURS 6 - REGRESIA LINIARA SIMPLA**

#### Rezumat

- 1. Formularea problemei
- 2. Definitia regresiei liniara simple
- 3. Estimarea dreptei de regresie
- 4. Teste asupra coeficientilor si semnificatiei modelului
- 5. Test asupra dreptei de regresie in R
- 6. Analiza calitatii modelului
- 7. Predictia
- 8. Codul in R

## 1. Formularea problemei

- Fisier de lucru: data1.csv
- Care este relatia intre inaltime (height) si greutate (weight)
- Cand inaltimea creste, creste si greutatea?
- Cunoscand greutatea (weight), puteti prezice inaltimea?

#### Exemplu:

Studiati relatia dintre greutate si inaltime pentru persoanele din esantionul dat in data1.csv

- Incarcati fisierul
- Calculati media greutatilor so inaltimilor: m=?
- Calculati dispersia greutatilor so inaltimilor: s<sup>2</sup>=?
- Construiti histogramele si boxplot-urile pentru greutate si inaltime
- Faceti graficul greutatii fata de inaltime
- Cod R:

```
data1<-read.csv("E:\\data1.csv", sep=",", header=TRUE)
data1
weight<-data1[,1]
height<-data1[,2]
par(mfrow=c(2,2))
hist(weight, col="blue")
boxplot(weight, col="blue")
hist(height, col="red")
boxplot(height, col="red")
mean(weight)
var(weight)
mean(height)
plot(weight, height)</pre>
```

# 2. Definitia regresiei liniara simple

- Regresia lui Y in functie de X
  - Y= height(cm)
  - X= weight (Kg)
- Se determina relatia lui Y fata de X ⇒ height= f(weight)
- Functie liniara  $E(height|weight) = \alpha + \beta*weight$
- Pentru fiecare individ

height = 
$$\alpha + \beta$$
\*weight +  $\epsilon$  Eroare individuala

# 3. Estimarea dreptei de regresie

Dreapta de regresie se determina astfel ca suma patratelor errorilor (SCE) sa fie minima

$$y_{i} = \alpha + \beta \times x_{i} + \varepsilon_{i}$$

$$E(Y/X) = \alpha + \beta \times X$$

$$\Rightarrow \varepsilon_{i} = y_{i} - E(Y/X)$$

$$SCE = \sum_{i=1}^{n} (\varepsilon_{i})^{2}$$

- Estimator al pantei ( $\beta$ ):  $b = \frac{cov(X,Y)}{var(X)}$
- Estimator al intercept ( $\alpha$ ):  $a = E(Y) b \times E(Y|X)$
- Covarianta dintre inaltime si greutate: in R: cov(height, weight)
- Estimator al lui β: in R: b<-cov(height, weight)/var(weight); b</li>

# 4. Teste asupra coeficientilor si semnificatiei modelului

- Testul t asupra pantei:  $H_0$ :  $\beta = 0$ ,  $H_0$ :  $\beta \neq 0$ .
- Testul t asupra intercept:  $H_0$ :  $\alpha = 0$ ,  $H_0$ :  $\alpha \neq 0$ .
- Testul F asupra modelului in ansamblu:  $H_0$ :  $\alpha = \beta = 0$ ,  $H_1$ :  $\alpha$ ,  $\beta$  nu sunt nuli simultan

# 5. Test asupra dreptei de regresie in R: functia Im

- Se construieste modelul liniar: mod1<-lm(height~1 + weight)</li>
- Se vizualizeaza: mod1

Output-ul este dat in chemarul albeastru de mai jos.

## 6. Analiza calitatii modelului

• Intervalul de incredere pentru parametri: confint(mod1)

2.5 % 97.5 % (Intercept) 95.5045320 117.459904 weight 0.6789554 1.010671

- Coeficientul de corelatie: r = cor(weight, height); r
- Coeficientul de determinatie: R<sup>2</sup>: R<sup>2</sup>=var(mod1\$fitted.value)/var(height)

Obs: Coeficientul de determinatie se determina din: summary(mod1)

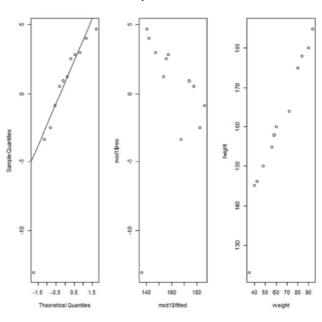
```
summary(mod1)
      Call:
      Im(formula = height ~ 1 + weight)
      Residuals:
      Min
             1Q Median
                          3Q Max
      -13.051 -1.300 1.071 2.863 4.725
      Coefficients:
                 Estimate Std. Error t value Pr(>|t|)
      (Intercept) 106.48222  4.92684  21.61 1.00e-09 ***
                weight
      Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 '' 1
      Residual standard error: 5.028 on 10 degrees of freedom
      Multiple R-squared: 0.928, Adjusted R-squared: 0.9208
      F-statistic: 128.8 on 1 and 10 DF, p-value: 4.926e-07
```

- Reziduurile sunt obtinute cu instructiunea: mod1\$res
- Teste asupra seriei reziduurilor:
  - o Normalitate: H<sub>0</sub>: seria este normal distribuita; H<sub>1</sub>: seria nueste normal distribuita
  - o Homoscedasticitate: H<sub>0</sub>: seria este homoscedastica (are varianta constanta);

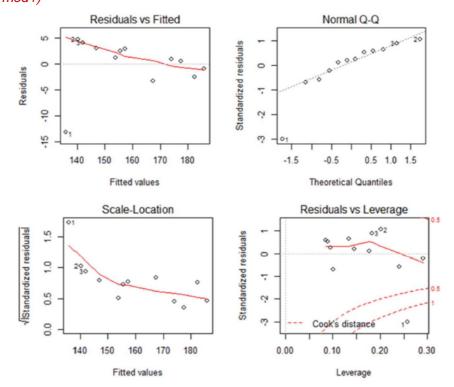
H<sub>1</sub>: seria este heteroscedastica

- Necorelare
- Reziduurile nu sunt corelate cu variabilele explicative

par(mfrow=c(1,3))
qqnorm(mod1\$res)
qqline(mod1\$res)
plot(mod1\$fitted,mod1\$res)
plot(weight,height)



# par(mfrow=c(2,2)) plot(mod1)



#### 7. Predictia

- Greutatea (weight)new.x=data.frame(weight=60.2)
- Predictia/estimarea unei anumite inaltimi (height)
   Tx<-predict(mod1,newdata=new.x,se.fit=TRUE)</li>
   Tx
- Intervalul de incredere al greutatii estimate (weight)
   Confint<-predict(mod1,newdata=new.x, interval="confidence")</li>
   Confint\$fit
- Intervalul de incredere al inaltimii estimate (height)
   Predint<-predict(mod1,newdata=new.x, interval="prediction")</li>
   Predint\$fit

### 8. Codul in R

data<-read.csv("data1.csv", sep=",", header=TRUE) data1

## weight height

- 1 35 123
- 2 40 145
- 3 42 146

```
4 48 150
```

```
weight<-data1[,1]
```

height<-data1[,2]

hist(height, col="red")

hist(weight, col="blue")

boxplot(height, col="red")

boxplot(weight, col="blue")

mean(weight)

var(weight)

mean(height)

var(height)

plot(weight, height)

cov(height, weight)

b<- cov(height, weight)/var(weight)

b

mod1<-lm(height~1+weight)

mod1

summary(mod1)

par(mfrow=c(1,3))

qqnorm(mod1\$res)

qqline(mod1\$res)

plot(mod1\$fitted,mod1\$res)

plot(weight,height)

par(mfrow=c(2,2))

X<-mod1\$res

library(fBasics)

ksnormTest(X)

shapiroTest(X)

library(nortest)

ad.test(X)

library(dplyr)

CO<-c(1,1,1,1,1,1,2,2,2,2,2,2)

B<-bartlett.test(X~CO)