TP1 MRRR

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Some preliminary exercices using R

```
options(digits=15)
   vecExp2 <- 0:19
   vecExp2 <- 2**vecExp2/factorial(vecExp2)</pre>
    ifelse(vecExp2 > 10e-8, vecExp2, NaN)
   [1] 1.0000000000000e+00 2.000000000000e+00 2.000000000000e+00
##
   [4] 1.3333333333333e+00 6.66666666666667e-01 2.6666666666667e-01
   [7] 8.88888888888889e-02 2.53968253968254e-02 6.34920634920635e-03
## [10] 1.41093474426808e-03 2.82186948853615e-04 5.13067179733846e-05
  [13] 8.55111966223077e-06 1.31555687111243e-06 1.87936695873204e-07
## [16]
                         NaN
                                              NaN
                                                                    NaN
## [19]
                         NaN
                                               NaN
    exp2 <- sum(vecExp2)</pre>
    exp2Fun \leftarrow exp(2)
    exp2
## [1] 7.38905609893017
    exp2Fun
## [1] 7.38905609893065
\mathbf{2}
  X \leftarrow rnorm(100, 2, 1)
##
     [1] 3.696370197811979
                             2.770705233653624
                                                2.167933161069842
##
     [4] 3.334088995621994
                             3.425087352930372 0.660150501524427
##
     [7] 2.426064723652296 1.881469772862444 3.830445380179677
##
   [10] 1.517194335735426
                             2.197801781842624 2.430392246838977
##
    [13]
         1.406821487507959
                             2.337419053790716 1.763254972884713
##
    [16]
         3.471679915774573 2.028409829269662 3.769172955029593
##
   [19] 2.148074254811381 2.129561179007547 1.685601125198869
   [22] 2.129307178556030 1.743982851292009 1.436453666535053
##
##
    [25]
         1.792150679335178 1.794262026944054 5.123607321043321
##
   [28] 2.680153027671806 0.768417597828371 1.961355626057995
   [31] 1.635145803152051 1.824988694761876 2.292056580262457
   [34] -0.199835055208149 3.771272203960827 2.500233556628374
```

```
[37]
          1.589084476943892 1.956879117950055 1.844052885012695
##
    Γ401
##
          1.482077126255446
                             1.315000193129441 0.855637499242235
          1.187994323758587
##
    Γ431
                              2.291881623028387
                                                 1.586403296354289
    [46]
##
          1.537686290935210
                             1.158936232209492
                                                 2.451576952509443
##
    [49]
          1.966823182155690
                             1.661408296437407
                                                 2.099052910209147
##
    [52]
          1.247898702508364
                             2.453304309804838 -0.281332576944774
##
    [55]
          0.480095450684390
                             0.981066941764108
                                                2.267888168448292
##
    [58]
          1.035159515682608
                             1.118616604967140
                                                 1.279515319532738
##
    [61]
          1.631431256884319
                              0.851369136206415
                                                 3.831701260852801
##
    [64]
          2.181417051023359
                             1.901873704947400
                                                 3.985194550394738
##
    [67]
          2.270990647583128
                             3.039110807119953
                                                 2.999693350927021
##
    [70]
          0.409668496781672
                             1.460731085158276
                                                 0.712650576562297
##
    [73]
          2.570600885436683
                             0.371127304036526
                                                 2.359395302441494
                                                2.403975145473124
##
    [76]
          2.230973007244742  0.850406780064600
    [79]
##
          1.188603768247239
                             1.343294166158727
                                                 1.026543653764786
##
    [82]
          3.907293167184541
                             0.434897162680367
                                                 1.496046918000502
##
    [85]
          0.995292396200524
                             2.200879258987288
                                                 1.802973452725702
          1.791968741479967
                             1.175092470586086
                                                 3.993593529066308
##
    [88]
##
    Г917
          2.964535657097422 -0.364794197898023
                                                2.960936008293669
          3.340733626440563
##
    [94]
                             1.550204498235391
                                                 3.781204503748137
##
    [97]
          2.154259336969947
                             0.620050547166380 0.967127930308633
## [100]
         3.985684768567337
  Y<- X*9.8
 γ
##
     [1] 36.22442793855740 27.15291128980552 21.24574497848446
```

```
##
     [4] 32.67407215709554 33.56585605871765 6.46947491493939
##
     [7] 23.77543429179250 18.43840377405195 37.53836472576084
    [10] 14.86850449020718 21.53845746205772 23.81784401902198
##
##
    [13] 13.78685057757800 22.90670672714901 17.27989873427019
##
    [16] 34.02246317459083 19.87841632684269 36.93789495929002
##
    [19] 21.05112769715153 20.86969955427396 16.51889102694891
##
    [22] 20.86721034984910 17.09103194266169 14.07724593204352
    [25] 17.56307665748474 17.58376786405173 50.21135174622454
##
##
    [28] 26.26549967118370 7.53049245871804 19.22128513536835
    [31] 16.02442887089010 17.88488920866638 22.46215448657208
##
##
    [34] -1.95838354103986 36.95846759881611 24.50228885495807
##
    [37] 15.57302787405015 19.17741535591054 18.07171827312441
    [40] 14.52435583730337 12.88700189266853 8.38524749257390
##
    [43] 11.64234437283416 22.46043990567819 15.54675230427203
##
    [46] 15.06932565116506 11.35757507565302 24.02545413459254
    [49] 19.27486718512576 16.28180130508659 20.57071852004964
##
##
    [52] 12.22940728458197 24.04238223608742 -2.75705925405878
##
         4.70493541670702 9.61445602928826 22.22530405079327
##
    [58] 10.14456325368956 10.96244272867797 12.53925013142083
    [61] 15.98802631746632 8.34341753482287 37.55067235635746
##
##
    [64] 21.37788710002893 18.63836230848452 39.05490659386843
##
    [67] 22.25570834631466 29.78328590977554 29.39699483908481
    [70] 4.01475126846038 14.31516463455110 6.98397565031051
##
##
    [73] 25.19188867727949 3.63704757955795 23.12207396392665
    [76] 21.86353547099847 8.33398644463308 23.55895642563662
##
##
    [79] 11.64831692882294 13.16428282835553 10.06012780689490
##
    [82] 38.29147303840850 4.26199219426760 14.66125979640492
##
    [85] 9.75386548276514 21.56861673807542 17.66913983671189
```

```
[88] 17.56129366650368 11.51590621174364 39.13721658484982
    [91] 29.05244943955474 -3.57498313940062 29.01717288127796
##
   [94] 32.73918953911752 15.19200408270683 37.05580413673174
## [97] 21.11174150230548 6.07649536223052 9.47785371702460
## [100] 39.05971073195990
  Y \leftarrow Y + rnorm(100, 0, 1/10)
Y
##
     [1] 36.26996597264141 27.15584368286268 21.29748700514993
     [4] 32.59544933941633 33.71857506410027 6.45094894055767
##
##
     [7] 23.57000905454849 18.45757096817719 37.63614057623924
    [10] 14.83297333540887 21.54083219145189 23.78311416924187
##
##
    [13] 13.76220780000121 23.03898211898244 17.40772899349749
##
   [16] 33.98408399906737 19.90948574221509 36.92600703562571
##
    [19] 20.95517746436380 20.73168688167556 16.53527480238708
    [22] 20.68076039705763 17.08665417507300 14.13141930595518
    [25] 17.45063300274658 17.60532166777738 50.09013335098771
##
    [28] 26.28811509078788 7.55758809544233 19.14073537115178
##
    [31] 15.91167101555200 18.02605721228631 22.52545754713207
##
    [34] -1.73501716039391 36.89858407585201 24.46977378159315
##
   [37] 15.77076982204956 19.21133272861112 18.27606336521176
   [40] 14.60501233140130 12.94872876003885 8.46359694144289
##
##
    [43] 11.59926500551942 22.56216792536139 15.51011507299322
    [46] 15.04543468741787 11.12707795888445 24.08799218936142
##
    [49] 19.24604208677216 16.42258334615351 20.54482110274946
   [52] 12.34660676218619 24.12088420974419 -2.69289469511277
##
    [55] 4.63431061478757 9.82257080332267 22.12744101036454
    [58] 10.25076624757465 10.84148284408467 12.59426883233272
##
   [61] 16.01412963100275 8.28225466796087 37.58014114191805
##
    [64] 21.29130648759161 18.60828604426972 38.99200321266174
    [67] 22.25761285153935 29.79330514286492 29.20474127775514
##
    [70] 4.32007880072156 14.43307589335862 6.95890271473353
   [73] 25.21504423309208 3.65865848080856 23.12118882000681
    [76] 21.94857316607278 8.43136779528830 23.59663715252677
##
##
    [79] 11.56842102520263 13.15709593685990 10.02575836083471
##
   [82] 38.27723120300045 4.31423172214091 14.60080045203070
    [85] 9.83278499653455 21.39831557043161 17.65917496750057
##
##
    [88] 17.76390872991439 11.64502814697404 39.06250110203233
    [91] 29.03187831443645 -3.60639630285457 29.13362898525666
##
   [94] 32.65118775015357 15.24682177881943 36.91778360867844
   [97] 21.11140942664519 5.95272594439783 9.48445166577624
## [100] 39.11446880461866
3
  dfxy <- data.frame(X,Y)</pre>
  write.table(dfxy,"WXY")
  rXY <- read.table("WXY")
  rXY-dfxy
##
                           X
```

8.88178419700125e-16 -7.10542735760100e-15

1

```
## 2
       -3.99680288865056e-15 1.42108547152020e-14
## 3
       -2.66453525910038e-15 -3.19744231092045e-14
##
  4
       -3.99680288865056e-15 -2.84217094304040e-14
       -2.66453525910038e-15 2.84217094304040e-14
##
  5
##
  6
       -1.11022302462516e-16 1.77635683940025e-15
##
  7
       3.99680288865056e-15 1.06581410364015e-14
##
  8
       -3.55271367880050e-15 1.42108547152020e-14
## 9
        2.66453525910038e-15 -3.55271367880050e-14
##
        3.99680288865056e-15 2.66453525910038e-14
  10
##
  11
       -3.99680288865056e-15 1.42108547152020e-14
  12
        2.66453525910038e-15 3.19744231092045e-14
##
  13
        1.33226762955019e-15 -1.24344978758018e-14
  14
##
        4.44089209850063e-15 -3.90798504668055e-14
       -2.88657986402541e-15 7.10542735760100e-15
##
  15
       -3.55271367880050e-15 2.84217094304040e-14
## 16
##
       -2.22044604925031e-15 1.42108547152020e-14
  17
       -3.55271367880050e-15 -7.10542735760100e-15
##
  18
       -8.88178419700125e-16 -3.55271367880050e-15
##
   19
       3.10862446895044e-15 3.55271367880050e-14
##
  20
##
  21
        1.33226762955019e-15 1.77635683940025e-14
##
  22
       -4.44089209850063e-16 -2.48689957516035e-14
##
  23
       1.33226762955019e-15 3.55271367880050e-15
       -3.33066907387547e-15 2.13162820728030e-14
## 24
##
  25
        2.22044604925031e-15 2.13162820728030e-14
##
  26
       -3.99680288865056e-15 2.13162820728030e-14
  27
       -8.88178419700125e-16 -1.42108547152020e-14
        4.44089209850063e-15 2.13162820728030e-14
##
  28
##
   29
        1.11022302462516e-16 -3.55271367880050e-15
##
   30
       -4.66293670342566e-15 2.13162820728030e-14
##
  31
       -8.88178419700125e-16 3.55271367880050e-15
##
  32
        4.21884749357559e-15 -7.10542735760100e-15
##
   33
        3.10862446895044e-15 2.48689957516035e-14
##
   34
        3.60822483003176e-16 3.33066907387547e-15
        3.55271367880050e-15 -1.42108547152020e-14
##
  35
   36
       -3.99680288865056e-15 4.97379915032070e-14
##
##
  37
       -2.22044604925031e-15 3.90798504668055e-14
##
  38
       -4.88498130835069e-15 -2.13162820728030e-14
##
  39
       -4.66293670342566e-15 3.90798504668055e-14
        3.77475828372553e-15 -1.77635683940025e-15
##
  40
##
       -1.33226762955019e-15 4.97379915032070e-14
  41
  42
        3.33066907387547e-16 0.0000000000000e+00
        2.44249065417534e-15 -1.42108547152020e-14
##
  43
##
  44
        3.10862446895044e-15 7.10542735760100e-15
        1.11022302462516e-15 -2.30926389122033e-14
##
  45
  46
        4.44089209850063e-16 2.66453525910038e-14
       -1.99840144432528e-15 4.97379915032070e-14
##
  47
##
  48
       -2.66453525910038e-15 -1.77635683940025e-14
##
  49
        4.44089209850063e-16 3.90798504668055e-14
        2.88657986402541e-15 -1.42108547152020e-14
##
  50
        3.55271367880050e-15 3.90798504668055e-14
## 51
## 52
       -3.55271367880050e-15 5.32907051820075e-15
## 53
       1.77635683940025e-15 1.42108547152020e-14
## 54
       -3.33066907387547e-16 -4.44089209850063e-16
       5.55111512312578e-17 2.66453525910038e-15
## 55
```

```
## 56
        0.00000000000000e+00 -1.77635683940025e-15
##
  57
       -2.22044604925031e-15 -3.55271367880050e-14
##
  58
        2.22044604925031e-15 -4.79616346638068e-14
##
  59
        0.00000000000000e+00 3.01980662698043e-14
##
   60
        1.99840144432528e-15 -2.30926389122033e-14
        1.11022302462516e-15 -4.97379915032070e-14
##
   61
  62
       -3.33066907387547e-16 5.32907051820075e-15
##
  63
       -1.33226762955019e-15 -4.97379915032070e-14
##
   64
        4.44089209850063e-16 -7.10542735760100e-15
##
   65
       -4.44089209850063e-16 -1.77635683940025e-14
##
   66
        2.22044604925031e-15 -3.55271367880050e-14
   67
        2.22044604925031e-15 4.61852778244065e-14
##
##
   68
       -3.10862446895044e-15 -1.77635683940025e-14
##
   69
       -1.33226762955019e-15 -3.90798504668055e-14
##
  70
        2.77555756156289e-16 -8.88178419700125e-16
##
  71
        4.44089209850063e-15 -1.77635683940025e-14
        0.0000000000000e+00 3.55271367880050e-15
##
  72
##
  73
       -2.66453525910038e-15 2.13162820728030e-14
##
        2.77555756156289e-16 2.22044604925031e-15
  74
##
  75
       -3.99680288865056e-15 -1.42108547152020e-14
##
  76
       -1.77635683940025e-15 2.13162820728030e-14
        0.0000000000000e+00 -1.77635683940025e-15
##
  77
       -3.55271367880050e-15 3.19744231092045e-14
##
  78
        1.11022302462516e-15 -3.37507799486048e-14
##
   79
##
  80
        2.66453525910038e-15 0.00000000000000e+00
  81
        4.21884749357559e-15 -1.06581410364015e-14
       -8.88178419700125e-16 -4.97379915032070e-14
##
  82
        1.66533453693773e-16 -3.55271367880050e-15
##
   83
       -1.99840144432528e-15 5.32907051820075e-15
##
   84
##
   85
       0.00000000000000e+00 -1.77635683940025e-15
##
  86
        1.77635683940025e-15 -1.06581410364015e-14
##
   87
       -2.44249065417534e-15 3.55271367880050e-14
##
  88
        2.66453525910038e-15 7.10542735760100e-15
        4.21884749357559e-15 -3.90798504668055e-14
##
  89
##
   90
        2.22044604925031e-15 -2.84217094304040e-14
       -1.77635683940025e-15 -4.61852778244065e-14
##
  91
##
  92
       -2.77555756156289e-16 1.33226762955019e-15
##
  93
       8.88178419700125e-16 4.26325641456060e-14
  94
       -2.66453525910038e-15 3.55271367880050e-14
##
       -1.11022302462516e-15 -2.66453525910038e-14
##
  95
        2.66453525910038e-15 -4.26325641456060e-14
        3.10862446895044e-15 7.10542735760100e-15
##
  97
        0.00000000000000e+00 -3.55271367880050e-15
  98
       -1.11022302462516e-16 1.77635683940025e-15
  99
## 100 3.10862446895044e-15 4.26325641456060e-14
  #tous les valeur sont changés un peu
```

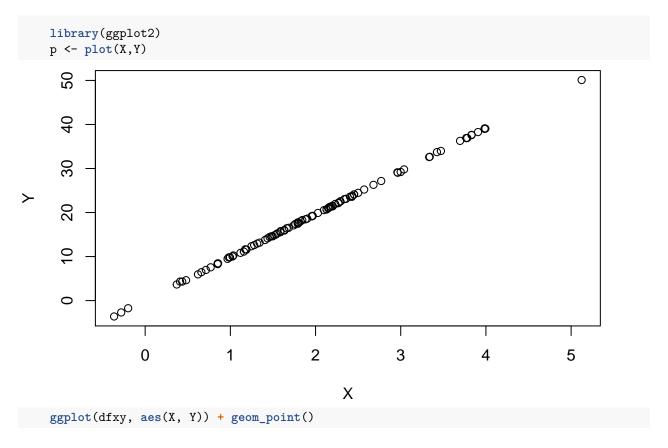
```
dfxy <- data.frame(X,Y)
save(dfxy,file = "xy.RData")
pdfxy <- dfxy</pre>
```

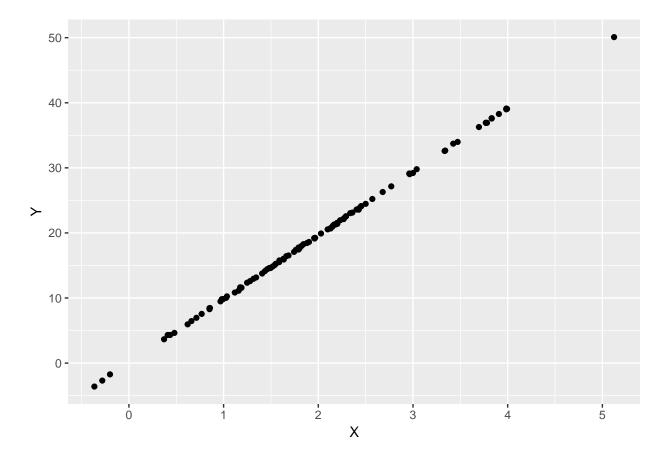
```
rm(dfxy)
load("xy.RData")
pdfxy - dfxy
```

49 0 0

```
## 50 0 0
## 51 0 0
## 52
      0 0
## 53
      0 0
## 54
       0 0
## 55
      0 0
## 56
      0 0
## 57
       0 0
## 58
       0 0
## 59
      0 0
## 60
      0 0
## 61
      0 0
## 62
       0 0
## 63
       0 0
## 64
       0 0
## 65
       0 0
## 66
      0 0
## 67
       0 0
## 68
      0 0
## 69
       0 0
## 70
      0 0
## 71
      0 0
## 72
      0 0
## 73
       0 0
## 74
      0 0
## 75
      0 0
## 76
      0 0
## 77
       0 0
## 78
      0 0
## 79
      0 0
## 80
       0 0
## 81
      0 0
## 82
       0 0
## 83
       0 0
## 84
       0 0
## 85
       0 0
## 86
      0 0
## 87
      0 0
## 88
       0 0
## 89
      0 0
## 90
       0 0
## 91
      0 0
## 92
       0 0
## 93
      0 0
## 94
      0 0
## 95
      0 0
## 96
       0 0
## 97
       0 0
## 98
      0 0
## 99 0 0
## 100 0 0
```

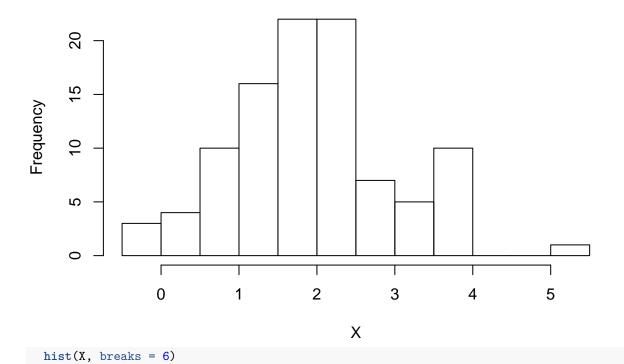
#tous les valeur ne sont pas changés



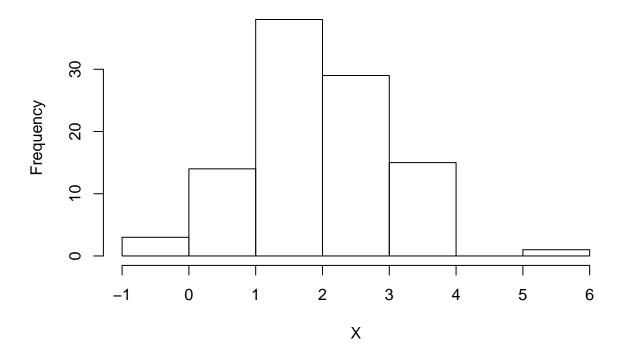


hist(X)

Histogram of X



Histogram of X



1. Ordinary Least Square (OLS)

Priliminary work

```
tab <- read.table("TP1/data/immo.txt",sep = ";",header = TRUE)</pre>
##
      surface valeur prix
## 1
        153.1
                 573 748
## 2
        152.0
                 638 740
## 3
                 654 729
        162.5
                570 700
## 4
        143.3
                 638 749
## 5
        145.7
## 6
        173.3
                 632 760
## 7
                 602 720
        144.8
## 8
        149.1
                577 735
## 9
        152.5
                564 745
## 10
        138.9
                556 735
## 11
        151.8
                626 715
                 634 710
## 12
        144.4
## 13
        148.7
                 602 789
## 14
        186.3
                 672 865
## 15
        152.0
                571 680
## 16
       257.6
                 896 1020
## 17
        190.5
                 686 840
## 18
        153.7
                 601 690
## 19
                 663 880
        180.6
## 20
                 658 760
        163.5
head(tab)
##
     surface valeur prix
## 1
       153.1
                573 748
## 2
       152.0
                    740
                638
## 3
      162.5
                654
                    729
## 4
       143.3
                     700
                570
## 5
       145.7
                638
                     749
## 6
                632 760
       173.3
tail(tab)
      surface valeur prix
##
                 571 680
## 15
        152.0
## 16
        257.6
                 896 1020
## 17
       190.5
                 686 840
## 18
        153.7
                 601 690
## 19
        180.6
                 663 880
## 20
        163.5
                 658 760
  #take the nom of all of colums
names(tab)
## [1] "surface" "valeur" "prix"
  #take the first colums
  #tab[,1]
```

```
#take the colums 'surface'
#tab$surface

#take the first and third colum
#tab[,c(1,3)]

#tab$prix

#nrow(tab)

#dim(tab)

# plot(tab)
cor(tab)
### surface valeur prix
```

```
## surface valeur prix

## surface 1.00000000000000 0.925710552993891 0.913319494330805

## valeur 0.925710552993891 1.0000000000000 0.851384140800712

## prix 0.913319494330805 0.851384140800712 1.0000000000000000
```

Fisrt model using Ordinary Least Square

a)

```
c1 = rep(1,20)
tab <- read.table("TP1/data/immo.txt",sep = ";",header = TRUE)
tab=data.frame(c1,tab)

X <- as.matrix(tab[,c(1,2,3)])
Y <- as.matrix(tab[,4])

belta <- solve(t(X)%*%X)%*%t(X)%*%Y
belta

### [,1]</pre>
```

```
## c1 309.6656633509080621

## surface 2.6343996248646016

## valeur 0.0451838603054422

#beta0 <- belta[1,1]

#beta1 <- belta[2,1]

#beta2 <- belta[3,1]

#beta0+144.8*beta1+602*beta2
```

b)

```
tab <- read.table("TP1/data/immo.txt",sep = ";",header = TRUE)
modreg = lm(prix~.,data=tab)</pre>
```

```
#modreg
 # print(modreg)
  #summary(modreg)
  modreg$res
##
                                                             3
                         1.07829079474543 -38.30584703121945
##
     9.11740212725132
##
                                         5
                        26.67500843139191 -34.76331805303539
##
   -12.92992996816042
##
                                         8
##
     1.67258706476733
                         6.47426518548715
                                             8.10469664491914
##
                    10
                                        11
                                                            12
    34.29400242552018 -22.85262295661578
##
                                            -8.71953661506235
##
                    13
                                        14
                                                            15
##
    60.39842852779585
                        34.18213241150676
                                           -55.89439056478701
##
                    16
                                        17
                                                            18
##
    -8.77174554976054
                        -2.51492005720089
                                          -51.72838573622116
##
                    19
                                        20
    64.60486501598379 -10.12098209730588
##
  tab
##
      surface valeur prix
                  573 748
## 1
        153.1
## 2
        152.0
                  638 740
## 3
        162.5
                  654 729
## 4
        143.3
                  570
                       700
## 5
        145.7
                  638
                       749
## 6
                  632 760
        173.3
## 7
        144.8
                  602 720
                  577
## 8
                       735
        149.1
## 9
        152.5
                  564
                       745
## 10
        138.9
                  556 735
## 11
        151.8
                  626 715
## 12
                  634
        144.4
                       710
## 13
        148.7
                  602
                       789
                  672
## 14
        186.3
                       865
## 15
        152.0
                  571
                       680
## 16
        257.6
                  896 1020
## 17
        190.5
                  686
                       840
## 18
                  601
                       690
        153.7
## 19
        180.6
                  663
                       880
## 20
        163.5
                  658
                       760
  modreg$model
##
      prix surface valeur
## 1
       748
             153.1
                       573
## 2
       740
             152.0
                       638
## 3
       729
             162.5
                       654
## 4
       700
             143.3
                       570
```

5

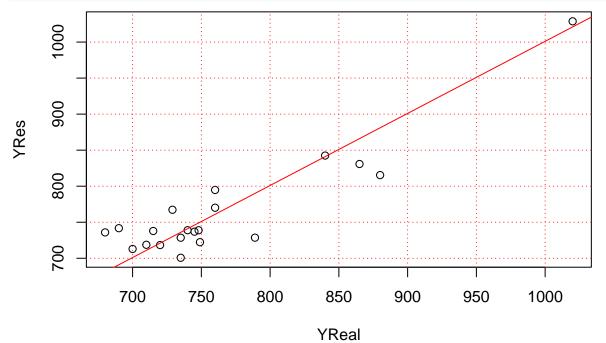
749

145.7

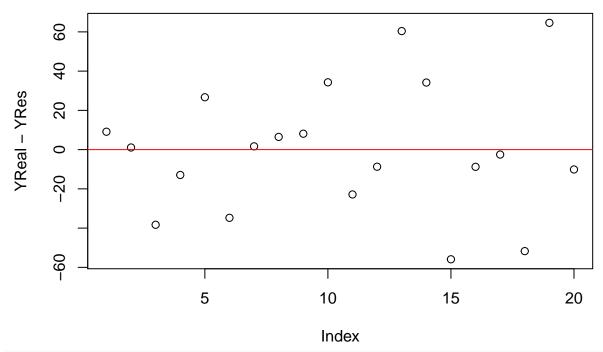
```
## 6
       760
              173.3
                        632
## 7
              144.8
       720
                        602
## 8
              149.1
       735
                        577
## 9
       745
              152.5
                       564
## 10
       735
              138.9
                        556
## 11
       715
              151.8
                        626
## 12
       710
              144.4
                        634
              148.7
## 13
       789
                        602
## 14
       865
              186.3
                        672
## 15
       680
              152.0
                        571
## 16 1020
              257.6
                        896
              190.5
                        686
## 17
       840
## 18
       690
              153.7
                        601
              180.6
## 19
       880
                        663
## 20
       760
              163.5
                        658
  help(lm)
```

c)

```
YReal <- tab$prix
YRes <- modreg$fitted.values
plot(YReal,YRes)
grid(col = "red")
abline(a = 1, b = 1,col = 2)</pre>
```



```
# The points above the red stright line represent the value being over estimated .
# The points below the red stright line represent the value being under estimated
plot(YReal-YRes)
abline(h = 0, col = 2)
```



This is another way to observe values that are underestimated or overestimated.

d)

```
#in statistics, the coefficient of determination, denoted R2 or r2 and pronounced "R squared", is the p
YReal <- tab$prix
YRes <- modreg$fitted.values

YMean <- sum(YReal)/length(YReal)

SSres <- sum((YRes-YReal)^2)
SSreg <- sum((YRes-YMean)^2)
SStot <- sum((YReal-YMean)^2)

R2 <- SSreg/SStot
R2

## [1] 0.834397032848454

R2_ <- 1 - SSres/SStot
R2_

## [1] 0.834397032848455

e)

#reference a)</pre>
```

2. The linear model

a)

```
tab <- read.table("TP1/data/Icecreamdata.txt", header = TRUE, sep = ";")
nrow(tab)
## [1] 30
dim(tab)
## [1] 30 4</pre>
```

$$Y = \beta_0 + \sum_{i=1}^{3} \beta_i X_i$$

b)

The consumption is proportional to the income and temps with the similar coefficients, but it is inversely proportional to the price with a large coefficient.

```
modIce <- lm(cons~.,tab)</pre>
```

output Model:

```
modIce

##
## Call:
## Im(formula = cons ~ ., data = tab)
##
## Coefficients:
## (Intercept) income price
## 0.19731507194759 0.00330776043967 -1.04441399193801
## temp
## 0.00345842973871
```

table anova:

```
anova(modIce)
## Analysis of Variance Table
##
## Response: cons
           Df
##
                                        Mean Sq F value
                                                           Pr(>F)
                         Sum Sq
           1 0.00028842772277 0.00028842772277 0.21260 0.648569
## income
            1 0.00822144362519 0.00822144362519 6.06012 0.020776 *
## price
             1 0.08174065756957 0.08174065756957 60.25195 3.1e-08 ***
## Residuals 26 0.03527283774913 0.00135664760574
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

```
X <- as.matrix(cbind(rep(1,nrow(tab)),tab[,c(2,3,4)]))
Y <- as.matrix(tab[,1])</pre>
```

d'apres le cours ,on sais $\beta = (X^t X)^{-1} X^t Y$

```
beta <- solve(t(X)%*%X)%*%t(X)%*%Y
Sjj<- solve(t(X)%*%X)
tValue <- vector(length = 4)
for(i in 1:4)
  tValue[i] <- beta[i]/sqrt(0.001357 * Sjj[i,i])
interval95 <- qt(1-0.05/2,26)
#interval95
pValue <- vector(length = 4)
for(i in 1:4)
  pValue[i] <- 2* pt(abs(tValue[i]),df = df.residual(modIce),lower.tail = FALSE)</pre>
tValue <- data.frame(tValue,pValue,row.names = c("b0","b1","b2","b3"))
#tValue
#summary(modIce)
confint(modIce,level = 0.95)
                               2.5 %
## (Intercept) -0.358122192681126161 0.75275233657630292
              0.000899875229897911 0.00571564564943604
## income
## price
               -2.759460028340869897 0.67063204446484792
## temp
               0.002542594983190466 0.00437426449422107
```