Bank_Data_Variance_Analysis.R

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```
bank <- read.csv("~/Spring 19 Sem/Multi Analysis/bank-additional/bank-</pre>
additional-full.csv", sep=";")
head(bank)
##
               job marital
                              education default housing loan
     age
                                                                 contact month
      56 housemaid married
                               basic.4y
                                                      no
                                                           no telephone
                                              no
                                                                           may
## 2
          services married high.school unknown
                                                           no telephone
                                                      no
                                                                           may
          services married high.school
                                                           no telephone
                                              no
                                                     ves
                                                                           may
## 4
     40
            admin. married
                               basic.6y
                                                      no
                                                           no telephone
                                                                           may
                                              no
## 5
      56
          services married high.school
                                                          yes telephone
                                              no
                                                      no
                                                                           may
## 6 45
          services married
                               basic.9y unknown
                                                            no telephone
                                                      no
                                                                           may
     day_of_week duration campaign pdays previous
                                                       poutcome emp.var.rate
## 1
                       261
                                  1
                                      999
             mon
                                                  0 nonexistent
                                                                          1.1
                                      999
## 2
             mon
                       149
                                  1
                                                  0 nonexistent
                                                                          1.1
## 3
                                      999
             mon
                       226
                                  1
                                                  0 nonexistent
                                                                          1.1
## 4
                       151
                                  1
                                       999
                                                  0 nonexistent
             mon
                                                                          1.1
## 5
                                       999
             mon
                       307
                                                  0 nonexistent
                                                                          1.1
## 6
             mon
                       198
                                  1
                                       999
                                                  0 nonexistent
                                                                          1.1
##
     cons.price.idx cons.conf.idx euribor3m nr.employed y
## 1
             93.994
                             -36.4
                                        4.857
                                                     5191 no
## 2
             93.994
                             -36.4
                                       4.857
                                                     5191 no
## 3
             93.994
                             -36.4
                                       4.857
                                                     5191 no
## 4
             93.994
                             -36.4
                                       4.857
                                                     5191 no
## 5
             93.994
                             -36.4
                                       4.857
                                                     5191 no
## 6
             93.994
                             -36.4
                                       4.857
                                                     5191 no
str(bank)
                     41188 obs. of 21 variables:
## 'data.frame':
                     : int 56 57 37 40 56 45 59 41 24 25 ...
## $ age
## $ iob
                     : Factor w/ 12 levels "admin.", "blue-collar", ...: 4 8 8 1
8 8 1 2 10 8 ...
                     : Factor w/ 4 levels "divorced", "married", ...: 2 2 2 2 2 2
## $ marital
2 2 3 3 ...
                     : Factor w/ 8 levels "basic.4y", "basic.6y", ...: 1 4 4 2 4
## $ education
3 6 8 6 4 ...
## $ default
                     : Factor w/ 3 levels "no", "unknown", ...: 1 2 1 1 1 2 1 2 1
1 ...
                     : Factor w/ 3 levels "no", "unknown", ..: 1 1 3 1 1 1 1 1 3
## $ housing
3 ...
## $ loan
                     : Factor w/ 3 levels "no", "unknown", ...: 1 1 1 1 3 1 1 1 1
```

```
## $ contact
                   : Factor w/ 2 levels "cellular", "telephone": 2 2 2 2 2 2
2 2 2 2 ...
## $ month
                   : Factor w/ 10 levels "apr", "aug", "dec", ...: 7 7 7 7 7 7 7
7 7 7 ...
## $ day_of_week
                   : Factor w/ 5 levels "fri", "mon", "thu", ...: 2 2 2 2 2 2 2
2 2 2 ...
                   : int 261 149 226 151 307 198 139 217 380 50 ...
## $ duration
## $ campaign
                   : int 111111111...
                   : int 999 999 999 999 999 999 999 999 ...
## $ pdays
## $ previous
                   : int 0000000000...
                   : Factor w/ 3 levels "failure", "nonexistent", ...: 2 2 2 2
## $ poutcome
2 2 2 2 2 2 ...
## $ emp.var.rate : num 1.1 1.1 1.1 1.1 1.1 1.1 1.1 1.1 1.1 ...
## $ cons.price.idx: num 94 94 94 94 ...
## $ cons.conf.idx : num -36.4 -36.4 -36.4 -36.4 -36.4 -36.4 -36.4 -36.4 -
36.4 - 36.4 ...
## $ euribor3m
                   : num 4.86 4.86 4.86 4.86 ...
## $ nr.employed
                   : num 5191 5191 5191 5191 ...
                   : Factor w/ 2 levels "no", "yes": 1 1 1 1 1 1 1 1 1 1 ...
## $ y
bank modified=bank
unique(bank$job)
                                   admin.
## [1] housemaid
                     services
                                                 blue-collar
                                                               technician
## [6] retired
                     management
                                   unemployed
                                                 self-employed unknown
## [11] entrepreneur student
## 12 Levels: admin. blue-collar entrepreneur housemaid ... unknown
summary(bank$job)
##
         admin.
                  blue-collar
                               entrepreneur
                                                housemaid
                                                             management
##
          10422
                         9254
                                       1456
                                                     1060
                                                                   2924
##
        retired self-employed
                                   services
                                                  student
                                                             technician
##
                         1421
                                       3969
                                                      875
                                                                   6743
           1720
##
     unemployed
                      unknown
##
           1014
                          330
#unknown = 0 ,student=1, unemployed=2, housemaid=3
#self-employed 4, entrepreneur 5, retired 6, management 7, services 8,
technician 9
# admin 11
            blue-collar
                           10
bank_job= ifelse(bank$job== 'admin.', 11,
                ifelse(bank$job=='blue-collar', 10,
                   ifelse(bank$job=='technician',9,
                         ifelse(bank$job=='services',8,
                             ifelse(bank$job=='management',7,
                                ifelse(bank$job=='retired',6,
                                    ifelse(bank$job=='entrepreneur',5,
                                           ifelse(bank$job=='self-
employed',4,
```

```
ifelse(bank$job=='housemaid',3,
ifelse(bank$job=='unemployed',2,
ifelse(bank$job=='student',1,0)))))))))
#added column in new dataframe bank modified
bank_modified=cbind(bank_modified,bank_job)
#head(bank modified[,c('education','bank education')],30)
#month from factor to numeric
unique(bank$month)
## [1] may jun jul aug oct nov dec mar apr sep
## Levels: apr aug dec jul jun mar may nov oct sep
#may jun jul aug oct nov dec mar apr sep
bank_month=ifelse(bank$month=='mar',3,
                  ifelse(bank$month=='apr',4,
                         ifelse(bank$month=='may',5,
                                ifelse(bank$month=='jun',6,
                                       ifelse(bank$month=='jul',7,
                                              ifelse(bank$month=='aug',8,
ifelse(bank$month=='sep',9,
ifelse(bank$month=='oct',10,
ifelse(bank$month=='nov',11,
ifelse(bank$month=='dec',12,0)))))))))
#adding it to data frame bank modified
bank_modified=cbind(bank_modified,bank_month)
#changing day of the week to numeric
#mon tue wed thu fri
bank_days=ifelse(bank$day_of_week=='mon',1,
                 ifelse(bank$day of week=='tue',2,
                        ifelse(bank$day_of_week=='wed',3,
                               ifelse(bank$day_of_week=='thu',4,
                                      ifelse(bank$day_of_week=='fri',5,0))))
bank modified=cbind(bank modified, bank days)
#loan from factor to numeric
```

```
bank_loan= ifelse(bank$loan=='yes',1,0)
bank modified=cbind(bank modified,bank loan)
#default from factor to numeric
bank default= ifelse(bank$default=='yes',1,0)
bank modified=cbind(bank modified,bank default)
#education from factor to numeric in the order of highest count: higher count
get the highest number
bank education=ifelse(bank$education=='illiterate',1,
                      ifelse(bank$education=='basic.6y',2,
                             ifelse(bank$education=='basic.4y',3,
ifelse(bank$education=='professional.course',4,
ifelse(bank$education=='basic.9y',5,
ifelse(bank$education=='high.school',6,
ifelse(bank$education=='university.degree',7,0) )))))
bank modified=cbind(bank modified,bank education)
bank contact=ifelse(bank$contact=='cellular',2,1)
bank modified=cbind(bank modified,bank contact)
#changing marital from factor to numeric
#married 3, single 2, divorced 1 and unknown 0
bank_marital=ifelse(bank$marital=='married',3,
                    ifelse(bank$marital=='single',2,
                           ifelse(bank$marital=='divorced',1,0)))
bank_modified=cbind(bank_modified,bank_marital)
#Housing from factor to numeric
bank_housing= ifelse(bank$housing=='yes',1,0)
bank_modified=cbind(bank_modified,bank_housing)
head(bank modified)
##
              job marital
                            education default housing loan
    age
                                                             contact month
## 1 56 housemaid married
                             basic.4y
                                           no
                                                   no
                                                        no telephone
                                                                       may
## 2 57 services married high.school unknown
                                                        no telephone
                                                   no
                                                                        may
## 3 37 services married high.school
                                                        no telephone
                                           no
                                                  yes
                                                                       may
## 4 40
            admin. married
                             basic.6v
                                                        no telephone
                                           no
                                                   no
                                                                       may
## 5 56 services married high.school
                                                   no yes telephone
                                           no
                                                                        may
```

```
## 6 45 services married
                               basic.9v unknown
                                                            no telephone
                                                       no
     day_of_week duration campaign pdays previous
                                                        poutcome emp.var.rate
                                       999
## 1
             mon
                       261
                                   1
                                                   0 nonexistent
                                                                           1.1
## 2
             mon
                       149
                                   1
                                       999
                                                   0 nonexistent
                                                                           1.1
                                       999
## 3
             mon
                       226
                                   1
                                                   0 nonexistent
                                                                           1.1
                                   1
                                       999
## 4
             mon
                       151
                                                   0 nonexistent
                                                                           1.1
## 5
                       307
                                   1
                                       999
             mon
                                                   0 nonexistent
                                                                           1.1
                                       999
## 6
             mon
                       198
                                   1
                                                   0 nonexistent
                                                                           1.1
     cons.price.idx cons.conf.idx euribor3m nr.employed y bank_job
## 1
             93.994
                             -36.4
                                        4.857
                                                                      3
                                                      5191 no
                                                                      8
## 2
             93.994
                             -36.4
                                        4.857
                                                      5191 no
                                                                      8
## 3
             93.994
                             -36.4
                                        4.857
                                                      5191 no
                                                      5191 no
## 4
             93.994
                             -36.4
                                        4.857
                                                                     11
## 5
             93.994
                             -36.4
                                        4.857
                                                      5191 no
                                                                      8
## 6
             93.994
                              -36.4
                                                                      8
                                        4.857
                                                      5191 no
     bank month bank days bank loan bank default bank education bank contact
## 1
               5
                         1
                                    0
                                                  0
                                                                  3
               5
## 2
                         1
                                                                  6
                                                                               1
                                    0
                                                  0
               5
## 3
                         1
                                    0
                                                  0
                                                                  6
                                                                               1
## 4
               5
                         1
                                    0
                                                  0
                                                                  2
                                                                               1
               5
## 5
                         1
                                    1
                                                  0
                                                                  6
                                                                                1
              5
                         1
                                                                  5
## 6
                                    0
                                                  0
                                                                                1
##
     bank_marital bank_housing
## 1
                 3
                              0
                 3
## 2
                              0
## 3
                 3
                              1
                 3
## 4
                              0
## 5
                 3
                              0
## 6
                 3
                              0
bank_y=ifelse(bank$y=='yes',1,0)
bank_modified=cbind(bank_modified,bank_y)
str(bank modified)
## 'data.frame':
                     41188 obs. of 31 variables:
## $ age
                     : int 56 57 37 40 56 45 59 41 24 25 ...
                     : Factor w/ 12 levels "admin.", "blue-collar", ...: 4 8 8 1
## $ job
8 8 1 2 10 8 ...
## $ marital
                     : Factor w/ 4 levels "divorced", "married", ...: 2 2 2 2 2 2
2 2 3 3 ...
## $ education
                     : Factor w/ 8 levels "basic.4y", "basic.6y", ...: 1 4 4 2 4
3 6 8 6 4 ...
## $ default
                     : Factor w/ 3 levels "no", "unknown", ...: 1 2 1 1 1 2 1 2 1
1 ...
                     : Factor w/ 3 levels "no", "unknown", ...: 1 1 3 1 1 1 1 1 3
## $ housing
3 ...
                     : Factor w/ 3 levels "no", "unknown",..: 1 1 1 1 3 1 1 1 1
## $ loan
1 ...
## $ contact
                     : Factor w/ 2 levels "cellular", "telephone": 2 2 2 2 2 2
2 2 2 2 ...
```

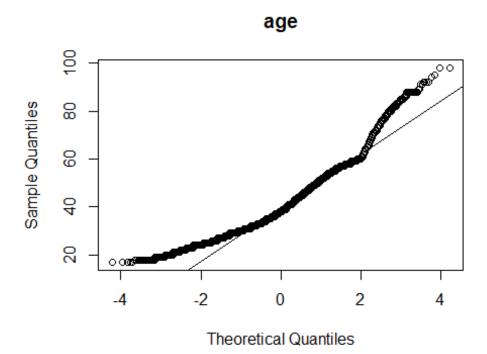
```
## $ month
                   : Factor w/ 10 levels "apr", "aug", "dec", ...: 7 7 7 7 7 7 7
777...
## $ day_of_week
                   : Factor w/ 5 levels "fri", "mon", "thu", ...: 2 2 2 2 2 2 2
2 2 2 ...
## $ duration
                   : int 261 149 226 151 307 198 139 217 380 50 ...
## $ campaign
                   : int 111111111...
                   : int 999 999 999 999 999 999 999 999 ...
## $ pdays
## $ previous
                   : int 0000000000...
                   : Factor w/ 3 levels "failure", "nonexistent", ...: 2 2 2 2
## $ poutcome
2 2 2 2 2 2 ...
## $ emp.var.rate : num 1.1 1.1 1.1 1.1 1.1 1.1 1.1 1.1 1.1 ...
## $ cons.price.idx: num 94 94 94 94 ...
## $ cons.conf.idx : num -36.4 -36.4 -36.4 -36.4 -36.4 -36.4 -36.4 -36.4 -
36.4 - 36.4 ...
## $ euribor3m
                   : num 4.86 4.86 4.86 4.86 ...
## $ nr.employed
                  : num 5191 5191 5191 5191 ...
## $ y
                   : Factor w/ 2 levels "no", "yes": 1 1 1 1 1 1 1 1 1 1 ...
## $ bank_job
                   : num 3 8 8 11 8 8 11 10 9 8 ...
## $ bank month
                   : num 555555555...
## $ bank days
                   : num 1 1 1 1 1 1 1 1 1 1 ...
## $ bank loan
                   : num 0000100000...
## $ bank_default : num 0000000000...
## $ bank education: num 3 6 6 2 6 5 4 0 4 6 ...
## $ bank contact : num 1 1 1 1 1 1 1 1 1 ...
## $ bank marital : num
                        3 3 3 3 3 3 3 3 2 2 ...
## $ bank housing : num 001000011...
## $ bank y
                   : num 0000000000...
bank int =
bank_modified[,c('age','duration','campaign','pdays','previous','emp.var.rate
','cons.price.idx','cons.conf.idx','euribor3m',
'nr.employed','bank_housing','bank_loan','bank_job','bank_education','bank_mo
nth',
'bank_days','bank_contact','bank_marital','bank_y')]
#x <- dist(scale(bank int, center = FALSE))</pre>
#as.dist(round(as.matrix(x), 2)[1:12, 1:12])
cm <- colMeans(bank int)</pre>
S <- cov(bank_int) #diagonals are variances</pre>
d <- apply(bank_int, MARGIN = 1, function(bank_int)t(bank_int - cm) %*%</pre>
solve(S) %*% (bank int - cm))
d
##
                                          11.200340
      [1]
           13.483570
                     10.965225
                                 8.465088
                                                     16.403112
                                                                7.753476
##
      [7] 11.963118
                                          10.980666
                     14.971289
                                11.415000
                                                     15.700590 10.306592
##
     [13] 15.187492
                     19.965754 11.485333 15.530186 11.344293 16.562457
```

```
## [41113]
            81.033098
                        85.361935
                                   88.177385
                                               75.392997
                                                           81.964863
                                                                      84.208448
## [41119]
            85.141638
                        80.272217
                                   86.662477
                                               88.238195
                                                           89.367902
                                                                      99.472986
## [41125] 102.761993
                        77.067039 145.321422
                                               87.138631
                                                           76.448562
                                                                      92.293726
  [41131]
            78.955814
                                               87.524382
                        78.715215
                                    78.677503
                                                           85.685552
                                                                      76.106175
## [41137] 123.862141
                        71.644332
                                   84.645921
                                               76.892583
                                                           80.549722
                                                                      81.009612
  [41143]
            87.927478
##
                        88.317288 141.653435
                                               80.691857
                                                           82.076280
                                                                      86.412189
   [41149]
            79.520392
                        77.112528
                                    70.023167
                                               84.653831
                                                           77.547485 152.020299
##
   [41155]
            75.347386
                        89.714883
                                    77.400000
                                               79.860380
                                                           81.576760 106.642264
            80.558208
  [41161]
                        72.149816
                                   94.636587
                                               78.714148 121.887284
                                                                      81.597929
   [41167]
            86.176878
                        76.333764
                                   76.053576
                                               79.277298 140.953475
                                                                      97.895356
##
##
  [41173]
            78.012911
                        87.086140 197.290508
                                               89.405360
                                                           85.291229
                                                                      78.584659
            86.998770
                        84.778475
##
  [41179]
                                   78.979693
                                               81.191204
                                                           96.162788
                                                                      87.684716
##
   [41185]
            78.492152
                        79.813539
                                   78.866403
                                               79.565061
S
##
                                       duration
                                                      campaign
                                                                        pdays
                             age
## age
                   108.602451165 -2.339147e+00
                                                  0.132602905 -6.694540e+01
                    -2.339146942
                                                -51.494888397 -2.305683e+03
## duration
                                  6.722573e+04
   campaign
                     0.132602905 -5.149489e+01
                                                  7.672975028
                                                                2.722492e+01
   pdays
                   -66.945399639 -2.305683e+03
                                                 27.224921359
                                                                3.493569e+04
##
   previous
                     0.125660856
                                                 -0.108493675 -5.434645e+01
                                   2.648520e+00
## emp.var.rate
                    -0.006068627 -1.139180e+01
                                                  0.656017208
                                                                7.957482e+01
## cons.price.idx
                                  7.972716e-01
                     0.005167908
                                                  0.204971433
                                                                8.535132e+00
## cons.conf.idx
                     6.239800832 -9.807412e+00
                                                 -0.176060671 -7.901668e+01
## euribor3m
                     0.194622473 -1.479383e+01
                                                  0.649236419
                                                                9.625087e+01
## nr.employed
                   -13.346159899 -8.374399e+02
                                                 28.838822297
                                                                5.031877e+03
## bank housing
                    -0.007359781 -8.810154e-01
                                                 -0.014941021 -1.000641e+00
## bank loan
                    -0.026909690
                                  1.127191e-02
                                                  0.005260933 -5.769701e-03
## bank job
                    -2.942361746 -4.332399e+00
                                                               2.971107e+01
                                                  0.099531269
## bank education
                    -3.499404013 -4.902691e+00
                                                 -0.014834970 -5.131918e+00
## bank_month
                     1.643396595 -1.021420e+01
                                                 -0.173194966 -3.034951e+01
## bank days
                                   3.860555e+00
                                                                1.784832e+00
                    -0.271924763
                                                  0.059031862
  bank contact
                    -0.035230419
                                   3.327960e+00
                                                 -0.103191259 -1.061719e+01
## bank_marital
                     0.834924575 -2.204498e-01
                                                 -0.004379889
                                                                2.296641e+00
## bank y
                     0.100161695
                                   3.322321e+01
                                                 -0.058116134 -1.920123e+01
##
                        previous
                                  emp.var.rate cons.price.idx cons.conf.idx
## age
                    1.256609e-01
                                   -0.006068627
                                                   0.005167908
                                                                  6.239800832
## duration
                    2.648520e+00 -11.391802119
                                                   0.797271590
                                                                 -9.807411936
## campaign
                   -1.084937e-01
                                   0.656017208
                                                   0.204971433
                                                                 -0.176060671
   pdays
                   -5.434645e+01
                                   79.574823033
                                                   8.535132485 -79.016677080
   previous
##
                    2.449271e-01
                                   -0.326917530
                                                   -0.058190350
                                                                 -0.116669718
## emp.var.rate
                   -3.269175e-01
                                    2.467914506
                                                   0.705038043
                                                                  1.425359699
## cons.price.idx -5.819035e-02
                                    0.705038043
                                                   0.335055802
                                                                  0.158023171
## cons.conf.idx
                   -1.166697e-01
                                    1.425359699
                                                   0.158023171
                                                                 21.420215396
## euribor3m
                   -3.901282e-01
                                    2.649120795
                                                   0.690960743
                                                                  2.229088852
## nr.employed
                   -1.792634e+01 102.944953096
                                                  21.832545607
                                                                 33.611125259
## bank housing
                   5.053787e-03
                                   -0.046967770
                                                   -0.023682580
                                                                 -0.079736240
## bank_loan
                   -3.805283e-04
                                    0.000672042
                                                   -0.001234151
                                                                 -0.022700209
## bank job
                   -7.011819e-02
                                   0.305567788
                                                   0.033233387
                                                                 -0.543150008
```

```
## bank education
                    1.717054e-02
                                   -0.134824416
                                                  -0.091864771
                                                                  0.080741473
## bank month
                    6.439781e-02
                                   0.188769535
                                                  -0.177624990
                                                                  2.495921179
## bank_days
                    2.803357e-03
                                  -0.009758766
                                                  -0.003747063
                                                                 -0.000647943
## bank contact
                    5.072123e-02
                                  -0.297718079
                                                  -0.164852751
                                                                 -0.560723493
## bank_marital
                   -1.042179e-02
                                   0.053560974
                                                   0.010080996
                                                                  0.164508488
## bank_y
                    3.601747e-02
                                  -0.148181434
                                                  -0.024928537
                                                                  0.080303622
##
                       euribor3m
                                   nr.employed bank housing
                                                                  bank loan
## age
                    1.946225e-01
                                   -13.34615990
                                                -0.007359781 -0.0269096903
  duration
                   -1.479383e+01 -837.43986594 -0.881015369
                                                               0.0112719132
   campaign
                                   28.83882230 -0.014941021
                    6.492364e-01
                                                               0.0052609329
   pdays
                    9.625087e+01 5031.87747726 -1.000640878
                                                             -0.0057697014
##
   previous
                   -3.901282e-01
                                   -17.92634155
                                                 0.005053787
                                                              -0.0003805283
                                  102.94495310 -0.046967770
   emp.var.rate
                    2.649121e+00
                                                               0.0006720420
  cons.price.idx
                    6.909607e-01
                                   21.83254561 -0.023682580 -0.0012341509
## cons.conf.idx
                    2.229089e+00
                                   33.61112526 -0.079736240
                                                              -0.0227002088
## euribor3m
                    3.008308e+00
                                  118.44342135 -0.051032986
                                                             -0.0003029111
## nr.employed
                    1.184434e+02 5220.28325040 -1.625501118
                                                               0.1089889629
  bank housing
                   -5.103299e-02
                                   -1.62550112
                                                 0.249437620
                                                               0.0101497034
   bank loan
                   -3.029111e-04
                                     0.10898896
                                                 0.010149703
                                                               0.1286865203
##
## bank job
                    3.009990e-01
                                   16.87042768 -0.000599546
                                                               0.0095512656
## bank education -1.215829e-01
                                   -3.46369470
                                                 0.013488811
                                                               0.0083561490
## bank month
                    5.784763e-01
                                   19.56820263
                                                 0.033895322
                                                             -0.0012414380
## bank days
                   -1.359129e-02
                                   -0.07489496 -0.006542088
                                                               0.0009365872
## bank contact
                   -3.338696e-01
                                   -9.36380789
                                                 0.020314116
                                                               0.0023088497
   bank marital
                    6.601380e-02
                                     2.52009321 -0.001858772
                                                               0.0003992101
##
   bank y
                   -1.687776e-01
                                    -8.10227564
                                                 0.001854313 -0.0005065497
##
                       bank job bank education
                                                   bank month
                                                                   bank days
## age
                   -2.942361746
                                   -3.499404013
                                                  1.643396595 -0.2719247626
  duration
                   -4.332399142
                                   -4.902691443
                                                -10.214195870
                                                                3.8605553591
   campaign
                    0.099531269
                                   -0.014834970
                                                 -0.173194966
                                                                0.0590318619
##
   pdays
                   29.711067606
                                   -5.131917536
                                                -30.349513624
                                                                1.7848315446
   previous
##
                   -0.070118187
                                   0.017170543
                                                  0.064397806
                                                                0.0028033574
   emp.var.rate
                    0.305567788
                                   -0.134824416
                                                  0.188769535 -0.0097587660
  cons.price.idx
                   0.033233387
                                   -0.091864771
                                                 -0.177624990 -0.0037470626
  cons.conf.idx
                   -0.543150008
                                   0.080741473
                                                  2.495921179 -0.0006479430
## euribor3m
                    0.300998973
                                   -0.121582906
                                                  0.578476282 -0.0135912892
## nr.employed
                   16.870427679
                                   -3.463694700
                                                 19.568202631 -0.0748949643
## bank_housing
                   -0.000599546
                                                  0.033895322 -0.0065420877
                                   0.013488811
## bank_loan
                    0.009551266
                                   0.008356149
                                                 -0.001241438
                                                                0.0009365872
   bank job
##
                    7.296841069
                                   0.458591949
                                                 -0.241356037
                                                                0.0399007279
                                                  0.324628213 -0.0185007988
   bank_education
                    0.458591949
                                   3.491377171
## bank month
                   -0.241356037
                                   0.324628213
                                                  4.165671508 -0.0200490417
   bank days
                    0.039900728
                                   -0.018500799
                                                 -0.020049042
                                                                1.9923720588
   bank_contact
                    0.001663345
                                   0.078289694
                                                  0.318721440 -0.0133094652
   bank_marital
                   -0.008857822
                                   -0.128851803
                                                  0.005007848
                                                                0.0041410316
## bank_y
                   -0.047701363
                                   0.013616436
                                                  0.023997010
                                                                0.0044854483
##
                    bank_contact
                                  bank_marital
                                                       bank_y
## age
                    -0.035230419
                                  0.8349245747
                                                 1.001617e-01
## duration
                     3.327960119 -0.2204497908
                                                 3.322321e+01
## campaign
                    -0.103191259 -0.0043798889 -5.811613e-02
```

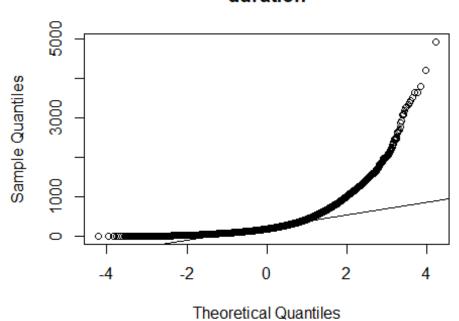
```
## pdays
                 -10.617191584
                                2.2966409027 -1.920123e+01
## previous
                   0.050721231 -0.0104217886
                                             3.601747e-02
## emp.var.rate
                  -0.297718079
                                0.0535609743 -1.481814e-01
                                0.0100809963 -2.492854e-02
## cons.price.idx
                  -0.164852751
## cons.conf.idx
                  -0.560723493
                                0.1645084877 8.030362e-02
## euribor3m
                  -0.333869619
                                0.0660137999 -1.687776e-01
## nr.employed
                  -9.363807894
                                2.5200932089 -8.102276e+00
## bank housing
                   0.020314116 -0.0018587722
                                              1.854313e-03
## bank loan
                   0.002308850 0.0003992101 -5.065497e-04
## bank job
                   0.001663345 -0.0088578225 -4.770136e-02
## bank education
                   0.078289694 -0.1288518035
                                              1.361644e-02
## bank month
                   0.318721440
                                0.0050078479
                                              2.399701e-02
## bank days
                  -0.013309465
                                0.0041410316 4.485448e-03
## bank contact
                   0.231848610 -0.0146157861
                                              2.204019e-02
## bank marital
                  -0.014615786
                                0.4855013047 -5.794485e-03
## bank y
                   0.022040191 -0.0057944855 9.996564e-02
cm
##
             age
                       duration
                                      campaign
                                                        pdays
                                                                    previous
##
                                                                   0.1729630
      40.0240604
                    258.2850102
                                     2.5675925
                                                  962.4754540
##
     emp.var.rate cons.price.idx
                                 cons.conf.idx
                                                    euribor3m
                                                                nr.emploved
##
       0.0818855
                     93.5756644
                                   -40.5026003
                                                    3.6212908
                                                                5167.0359109
##
     bank housing
                      bank loan
                                      bank_job bank_education
                                                                 bank month
##
       0.5238419
                      0.1516947
                                     8.4844129
                                                    5.1129698
                                                                  6.6078955
##
                   bank_contact
       bank_days
                                  bank marital
                                                       bank y
##
       2.9795814
                      1.6347480
                                     2.4893658
                                                    0.1126542
str(bank_int)
  'data.frame':
                   41188 obs. of 19 variables:
##
   $ age
                   : int
                          56 57 37 40 56 45 59 41 24 25 ...
                          261 149 226 151 307 198 139 217 380 50 ...
##
   $ duration
                   : int
                   : int
                          1 1 1 1 1 1 1 1 1 1 ...
##
   $ campaign
                          999 999 999 999 999 999 999 999 ...
##
  $ pdays
                   : int
   $ previous
##
                   : int
                         00000000000...
   $ emp.var.rate
                          : num
##
   $ cons.price.idx: num
                          94 94 94 94 ...
##
  $ cons.conf.idx : num
                          -36.4 -36.4 -36.4 -36.4 -36.4 -36.4 -36.4 -
36.4 - 36.4 ...
##
  $ euribor3m
                          4.86 4.86 4.86 4.86 ...
                   : num
##
   $ nr.employed
                   : num
                          5191 5191 5191 5191 5191 ...
                          0010000011...
##
   $ bank housing
                   : num
## $ bank loan
                   : num
                          0000100000...
##
   $ bank_job
                          3 8 8 11 8 8 11 10 9 8 ...
                   : num
##
   $ bank education: num
                          3 6 6 2 6 5 4 0 4 6 ...
   $ bank_month
                          5 5 5 5 5 5 5 5 5 5 ...
##
                   : num
##
   $ bank days
                          1 1 1 1 1 1 1 1 1 1 ...
                   : num
##
  $ bank contact
                     num
                          1 1 1 1 1 1 1 1 1 1 ...
                          3 3 3 3 3 3 3 2 2 ...
   $ bank marital
                   : num
##
   $ bank y
                          0000000000...
                   : num
```

```
qqnorm(bank_int[,"age"], main = "age")
#how nomal looks like - univariate normalization
qqline(bank_int[,"age"])
```



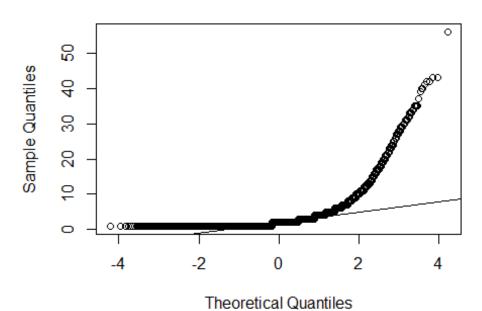
```
qqnorm(bank_int[,"duration"], main = "duration")
#how nomal looks like - univariate normalization
qqline(bank_int[,"duration"])
```

duration

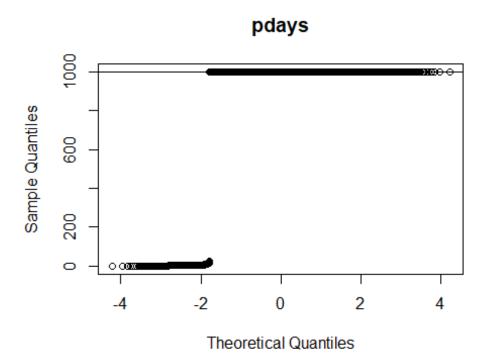


```
qqnorm(bank_int[,"campaign"], main = "campaign")
#how nomal looks like - univariate normalization
qqline(bank_int[,"campaign"])
```

campaign

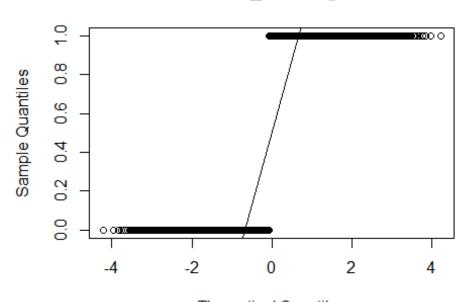


```
qqnorm(bank_int[,"pdays"], main = "pdays")
#how nomal looks like - univariate normalization
qqline(bank_int[,"pdays"])
```



```
qqnorm(bank_int[,"bank_housing"], main = "bank_housing")
#how nomal looks like - univariate normalization
qqline(bank_int[,"bank_housing"])
```

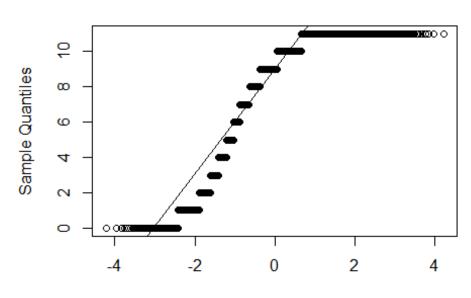
bank_housing



Theoretical Quantiles

```
qqnorm(bank_int[,"bank_job"], main = "bank_job")
#how nomal looks like - univariate normalization
qqline(bank_int[,"bank_job"])
```

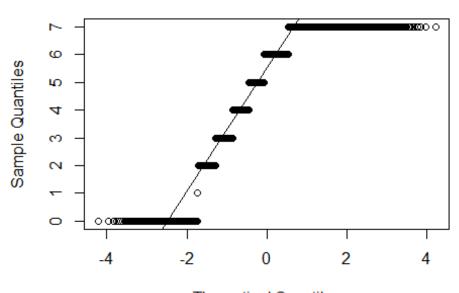
bank_job



Theoretical Quantiles

```
qqnorm(bank_int[,"bank_education"], main = "bank_education")
#how nomal looks like - univariate normalization
qqline(bank_int[,"bank_education"])
```

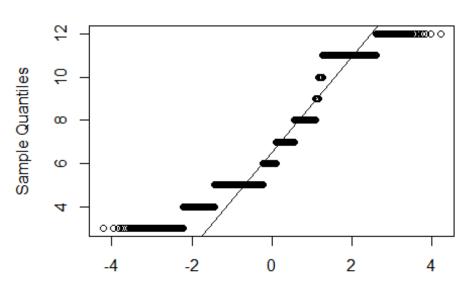
bank_education



Theoretical Quantiles

```
qqnorm(bank_int[,"bank_month"], main = "bank_month")
#how nomal looks like - univariate normalization
qqline(bank_int[,"bank_month"])
```

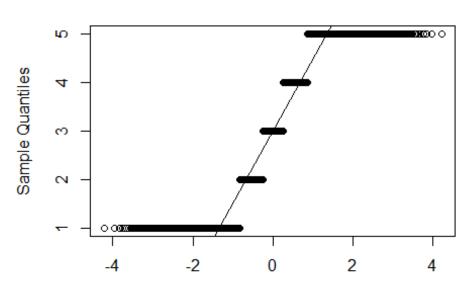
bank_month



Theoretical Quantiles

```
qqnorm(bank_int[,"bank_days"], main = "bank_days")
#how nomal looks like - univariate normalization
qqline(bank_int[,"bank_days"])
```

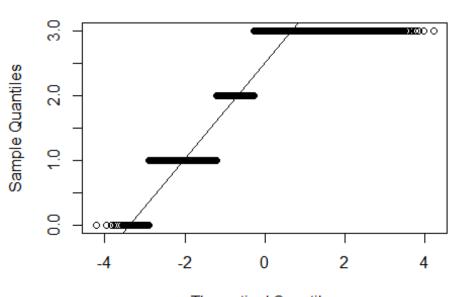
bank_days



Theoretical Quantiles

```
qqnorm(bank_int[,"bank_marital"], main = "bank_marital")
#how nomal looks like - univariate normalization
qqline(bank_int[,"bank_marital"])
```

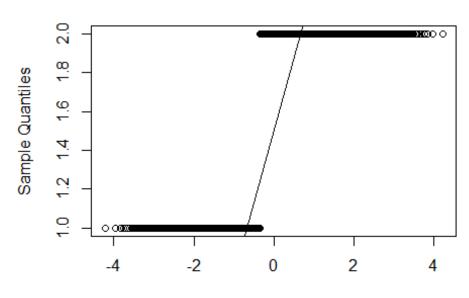
bank_marital



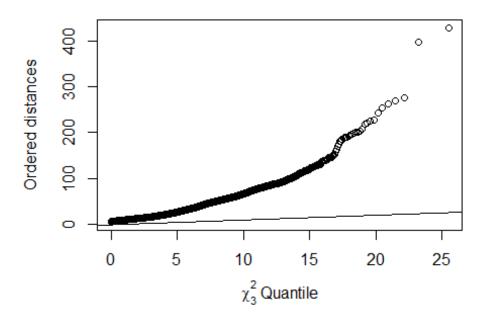
Theoretical Quantiles

```
qqnorm(bank_int[,"bank_contact"], main = "bank_contact")
#how nomal looks like - univariate normalization
qqline(bank_int[,"bank_contact"])
```

bank_contact



Theoretical Quantiles



```
t.test(bank$age[bank$y=="yes"],bank$age[bank$y=="no"],var.equal=TRUE)

##

## Two Sample t-test

##

## data: bank$age[bank$y == "yes"] and bank$age[bank$y == "no"]

## t = 6.1721, df = 41186, p-value = 6.802e-10

## alternative hypothesis: true difference in means is not equal to 0

## 95 percent confidence interval:

## 0.6837762 1.3201463

## sample estimates:

## mean of x mean of y

## 40.91315 39.91119

#Age is not significant
```

```
t.test(bank$duration[bank$y=="no"],bank$duration[bank$y=="yes"],var.equal=TRU
E)
##
##
   Two Sample t-test
## data: bank$duration[bank$y == "no"] and bank$duration[bank$y == "yes"]
## t = -89.967, df = 41186, p-value < 2.2e-16
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -339.5868 -325.1059
## sample estimates:
## mean of x mean of y
## 220.8448 553.1912
#Duration is Significant
t.test(bank modified$bank job[bank modified$y=='yes'],bank modified$bank job[
bank_modified$y=='no'], var.equal=TRUE)
##
##
  Two Sample t-test
##
## data: bank_modified$bank_job[bank_modified$y == "yes"] and
bank_modified$bank_job[bank_modified$y == "no"]
## t = -11.352, df = 41186, p-value < 2.2e-16
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -0.5595629 -0.3947923
## sample estimates:
## mean of x mean of y
## 8.060991 8.538169
#Job is significant
t.test(bank_modified$bank_housing[bank_modified$y=='yes'],bank_modified$bank_
housing[bank_modified$y=='no'], var.equal=TRUE)
##
##
   Two Sample t-test
## data: bank modified$bank housing[bank modified$y == "yes"] and
bank_modified$bank_housing[bank_modified$y == "no"]
## t = 2.3833, df = 41186, p-value = 0.01716
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 0.003294525 0.033804490
## sample estimates:
## mean of x mean of y
## 0.5403017 0.5217522
```

```
#housing is significant
t.test(bank modified$bank month[bank modified$y=='yes'],bank modified$bank mo
nth[bank modified$y=='no'], var.equal=TRUE)
##
## Two Sample t-test
##
## data: bank modified$bank month[bank modified$y == "yes"] and
bank modified$bank month[bank modified$y == "no"]
## t = 7.552, df = 41186, p-value = 4.373e-14
## alternative hypothesis: true difference in means is not equal to \theta
## 95 percent confidence interval:
## 0.1777505 0.3023547
## sample estimates:
## mean of x mean of y
## 6.820905 6.580853
#month is signficant
t.test(bank modified$bank loan[bank modified$y=='yes'],bank modified$bank lao
n[bank_modified$y=='no'], var.equal=TRUE)
##
## One Sample t-test
##
## data: bank_modified$bank_loan[bank_modified$y == "yes"]
## t = 28.297, df = 4639, p-value < 2.2e-16
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## 0.1370000 0.1573965
## sample estimates:
## mean of x
## 0.1471983
#laon is significant
t.test(bank modified$bank days[bank modified$y=='yes'],bank modified$bank day
s[bank_modified$y=='no'], var.equal=TRUE)
##
##
  Two Sample t-test
##
## data: bank_modified$bank_days[bank_modified$y == "yes"] and
bank modified$bank days[bank modified$y == "no"]
## t = 2.0398, df = 41186, p-value = 0.04137
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 0.001755341 0.087984462
## sample estimates:
```

```
## mean of x mean of v
## 3.019397 2.974527
#Days of week is significant
t.test(bank_modified$bank_default[bank_modified$y=='yes'],bank_modified$bank_
default[bank modified$y=='no'], var.equal=TRUE)
##
##
   Two Sample t-test
##
## data: bank modified$bank default[bank modified$y == "yes"] and
bank modified$bank default[bank modified$y == "no"]
## t = -0.61716, df = 41186, p-value = 0.5371
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -0.0003427733 0.0001786056
## sample estimates:
      mean of x
                   mean of v
## 0.000000e+00 8.208383e-05
#Default is not significant
t.test(bank_modified$bank_month[bank_modified$y=='yes'],bank_modified$bank_mo
nth[bank modified$y=='no'], var.equal=TRUE)
##
##
   Two Sample t-test
##
## data: bank modified$bank month[bank modified$y == "yes"] and
bank modified$bank month[bank modified$y == "no"]
## t = 7.552, df = 41186, p-value = 4.373e-14
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 0.1777505 0.3023547
## sample estimates:
## mean of x mean of y
## 6.820905 6.580853
#month is signficant
t.test(bank modified$bank education[bank modified$y=='yes'],bank modified$ban
k education[bank modified$y=='no'], var.equal=TRUE)
##
##
   Two Sample t-test
##
## data: bank modified$bank education[bank modified$y == "yes"] and
bank modified$bank education[bank modified$y == "no"]
## t = 4.6788, df = 41186, p-value = 2.895e-06
## alternative hypothesis: true difference in means is not equal to 0
```

```
## 95 percent confidence interval:
## 0.0791496 0.1932727
## sample estimates:
## mean of x mean of y
## 5.233836 5.097625
#Significant
t.test(bank_modified$bank_contact[bank_modified$y=='yes'],bank_modified$bank_
contact[bank_modified$y=='no'], var.equal=TRUE)
##
## Two Sample t-test
##
## data: bank modified$bank contact[bank modified$y == "yes"] and
bank_modified$bank_contact[bank_modified$y == "no"]
## t = 29.694, df = 41186, p-value < 2.2e-16
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 0.2059243 0.2350310
## sample estimates:
## mean of x mean of y
## 1.830388 1.609910
#significant
t.test(bank modified$bank marital[bank modified$y=='yes'],bank modified$bank
marital[bank_modified$y=='no'], var.equal=TRUE)
##
##
  Two Sample t-test
##
## data: bank_modified$bank_marital[bank_modified$y == "yes"] and
bank_modified$bank_marital[bank_modified$y == "no"]
## t = -5.3397, df = 41186, p-value = 9.358e-08
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -0.07924154 -0.03668801
## sample estimates:
## mean of x mean of y
## 2.437931 2.495896
#significant
t.test(bank$emp.var.rate[bank$y=="no"],bank$emp.var.rate[bank$y=="yes"],var.e
qual=TRUE)
##
## Two Sample t-test
##
## data: bank$emp.var.rate[bank$y == "no"] and bank$emp.var.rate[bank$y ==
```

```
"ves"1
## t = 63.434, df = 41186, p-value < 2.2e-16
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 1.436522 1.528126
## sample estimates:
## mean of x mean of y
## 0.2488755 -1.2334483
#Significant
t.test(bank$cons.price.idx[bank$y=="no"],bank$cons.price.idx[bank$y=="yes"],v
ar.equal=TRUE)
##
   Two Sample t-test
##
##
## data: bank$cons.price.idx[bank$y == "no"] and bank$cons.price.idx[bank$y
== "yes"]
## t = 27.903, df = 41186, p-value < 2.2e-16
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 0.2318544 0.2668878
## sample estimates:
## mean of x mean of y
## 93.60376 93.35439
#Significant
t.test(bank$cons.conf.idx[bank$y=="no"],bank$cons.conf.idx[bank$y=="yes"],van
.equal=TRUE)
##
##
   Two Sample t-test
##
## data: bank$cons.conf.idx[bank$y == "no"] and bank$cons.conf.idx[bank$y ==
"yes"]
## t = -11.154, df = 41186, p-value < 2.2e-16
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -0.9444742 -0.6621503
## sample estimates:
## mean of x mean of y
## -40.59310 -39.78978
#Significant
```

```
t.test(bank$euribor3m[bank$y=="no"],bank$euribor3m[bank$y=="yes"],var.equal=T
RUE)
##
## Two Sample t-test
## data: bank$euribor3m[bank$y == "no"] and bank$euribor3m[bank$y == "yes"]
## t = 65.647, df = 41186, p-value < 2.2e-16
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 1.637947 1.738766
## sample estimates:
## mean of x mean of y
## 3.811491 2.123135
#Significant
t.test(bank$nr.employed[bank$y=="no"],bank$nr.employed[bank$y=="yes"],var.equ
al=TRUE)
##
## Two Sample t-test
##
## data: bank$nr.employed[bank$y == "no"] and bank$nr.employed[bank$y ==
"yes"]
## t = 76.984, df = 41186, p-value < 2.2e-16
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 78.98706 83.11415
## sample estimates:
## mean of x mean of y
## 5176.167 5095.116
#Significant
t.test(bank$campaign[bank$y=="no"],bank$campaign[bank$y=="yes"],var.equal=TRU
E)
##
## Two Sample t-test
## data: bank$campaign[bank$y == "no"] and bank$campaign[bank$y == "yes"]
## t = 13.497, df = 41186, p-value < 2.2e-16
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 0.4969335 0.6657887
## sample estimates:
## mean of x mean of y
## 2.633085 2.051724
```

#significant library(Hotelling) ## Warning: package 'Hotelling' was built under R version 3.5.2 ## Loading required package: corpcor ## Warning: package 'corpcor' was built under R version 3.5.2 t2testbank_int <- hotelling.test(. ~ bank_y, data=bank_int) cat("T2 statistic =",t2testbank_int\$stat[[1]],"\n") ## T2 statistic = 20882.55 print(t2testbank_int) ## Test stat: 1159.7 ## Numerator df: 18 ## Denominator df: 41169 ## P-value: 0</pre>

View(t2testbank_int)

Name	Туре	Value
t2testbank_int	list [2] (S3: hotelling.test)	List of length 2
stats	list [6]	List of length 6
statistic	double [1]	16.99393
m	double [1]	0.05553262
df	double [2]	18 41169
nx	integer [1]	41185
ny	integer [1]	3
р	integer [1]	18
pval	double [1]	0.5240185

```
#if we include bank_default it becomes singular #and it gives error Lapack routine dgesv: system is exactly singular: U[13,13] = 0
```

```
#no much info p should be less than .05
# testing Variation
# F-test for Total Length (not recommended)
#close to 1 F=.7 is not helping
var.test(bank_int$age[bank_int$bank_y=="1"],bank_int$age[bank_int$bank_y=="0"]
1)
##
## F test to compare two variances
##
## data: bank_int$age[bank_int$bank_y == "1"] and
bank_int$age[bank_int$bank_y == "0"]
## F = 1.9544, num df = 4639, denom df = 36547, p-value < 2.2e-16
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 1.872416 2.041412
## sample estimates:
## ratio of variances
             1.954372
Significant
var.test(bank_int$duration[bank_int$bank_y=="1"],bank_int$duration[bank_int$b
ank y=="0"]
##
## F test to compare two variances
## data: bank int$duration[bank int$bank y == "1"] and
bank_int$duration[bank_int$bank_y == "0"]
## F = 3.7525, num df = 4639, denom df = 36547, p-value < 2.2e-16
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 3.595103 3.919580
## sample estimates:
## ratio of variances
##
             3.752462
var.test(bank_int$campaign[bank_int$bank_y=="1"],bank_int$campaign[bank_int$b
ank y=="0"]
##
## F test to compare two variances
##
```

```
## data: bank int$campaign[bank int$bank y == "1"] and
bank int$campaign[bank int$bank y == "0"]
## F = 0.33626, num df = 4639, denom df = 36547, p-value < 2.2e-16
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 0.3221580 0.3512344
## sample estimates:
## ratio of variances
            0.3362589
var.test(bank int$pdays[bank int$bank y=="1"],bank int$pdays[bank int$bank y=
="0"])
##
## F test to compare two variances
## data: bank int$pdays[bank int$bank y == "1"] and
bank_int$pdays[bank_int$bank_y == "0"]
## F = 11.178, num df = 4639, denom df = 36547, p-value < 2.2e-16
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 10.70972 11.67633
## sample estimates:
## ratio of variances
##
             11.17849
var.test(bank_int$previous[bank_int$bank_y=="1"],bank_int$previous[bank_int$b
ank_y=="0"])
##
## F test to compare two variances
##
## data: bank int$previous[bank int$bank y == "1"] and
bank_int$previous[bank_int$bank_y == "0"]
## F = 4.4205, num df = 4639, denom df = 36547, p-value < 2.2e-16
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 4.235161 4.617407
## sample estimates:
## ratio of variances
             4.420535
var.test(bank_int$emp.var.rate[bank_int$bank_y=="1"],bank_int$emp.var.rate[ba
nk int$bank y=="0"])
##
## F test to compare two variances
## data: bank_int$emp.var.rate[bank_int$bank y == "1"] and
bank_int$emp.var.rate[bank_int$bank_y == "0"]
## F = 1.1988, num df = 4639, denom df = 36547, p-value < 2.2e-16
```

```
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 1.148483 1.252140
## sample estimates:
## ratio of variances
             1.198753
var.test(bank int$cons.price.idx[bank int$bank y=="1"],bank int$cons.price.id
x[bank int$bank y=="0"])
##
## F test to compare two variances
## data: bank_int$cons.price.idx[bank_int$bank_y == "1"] and
bank_int$cons.price.idx[bank_int$bank_y == "0"]
## F = 1.4652, num df = 4639, denom df = 36547, p-value < 2.2e-16
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 1.403792 1.530491
## sample estimates:
## ratio of variances
##
             1,465236
var.test(bank_int$cons.conf.idx[bank_int$bank_y=="1"],bank_int$cons.conf.idx[
bank int$bank y=="0"])
##
## F test to compare two variances
##
## data: bank int$cons.conf.idx[bank int$bank y == "1"] and
bank int$cons.conf.idx[bank int$bank y == "0"]
## F = 1.9549, num df = 4639, denom df = 36547, p-value < 2.2e-16
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 1.872955 2.041999
## sample estimates:
## ratio of variances
             1.954935
var.test(bank_int$euribor3m[bank_int$bank_y=="1"],bank_int$euribor3m[bank_int
bank v = 010 
##
## F test to compare two variances
## data: bank int$euribor3m[bank int$bank y == "1"] and
bank_int$euribor3m[bank_int$bank_y == "0"]
## F = 1.1315, num df = 4639, denom df = 36547, p-value = 1.184e-08
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 1.084082 1.181926
```

```
## sample estimates:
## ratio of variances
             1.131533
var.test(bank_int$nr.employed[bank_int$bank_y=="1"],bank_int$nr.employed[bank
int$bank y=="0"])
##
## F test to compare two variances
##
## data: bank int$nr.employed[bank int$bank y == "1"] and
bank_int$nr.employed[bank_int$bank_y == "0"]
## F = 1.8393, num df = 4639, denom df = 36547, p-value < 2.2e-16
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 1.762154 1.921197
## sample estimates:
## ratio of variances
##
             1.839284
var.test(bank_int$bank_housing[bank_int$bank_y=="1"],bank_int$bank_housing[ba
nk_int$bank_y=="0"])
##
## F test to compare two variances
## data: bank int$bank housing[bank int$bank y == "1"] and
bank_int$bank_housing[bank_int$bank_y == "0"]
## F = 0.99557, num df = 4639, denom df = 36547, p-value = 0.8451
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 0.9538252 1.0399128
## sample estimates:
## ratio of variances
##
            0.9955743
var.test(bank_int$bank_loan[bank_int$bank_y=="1"],bank_int$bank_loan[bank_int
bank y = 0"1
##
## F test to compare two variances
## data: bank_int$bank_loan[bank_int$bank_y == "1"] and
bank_int$bank_loan[bank_int$bank_y == "0"]
## F = 0.97268, num df = 4639, denom df = 36547, p-value = 0.2126
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 0.9318933 1.0160015
## sample estimates:
## ratio of variances
##
            0.9726825
```

```
var.test(bank int$bank job[bank int$bank y=="1"],bank int$bank job[bank int$b
ank y=="0"])
##
## F test to compare two variances
## data: bank_int$bank_job[bank_int$bank_y == "1"] and
bank int$bank_job[bank_int$bank_y == "0"]
## F = 1.3806, num df = 4639, denom df = 36547, p-value < 2.2e-16
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 1.322709 1.442091
## sample estimates:
## ratio of variances
##
             1.380605
var.test(bank_int$bank_education[bank_int$bank_y=="1"],bank_int$bank_educatio
n[bank_int$bank_y=="0"])
##
## F test to compare two variances
## data: bank int$bank education[bank int$bank v == "1"] and
bank int$bank education[bank int$bank y == "0"]
## F = 1.1133, num df = 4639, denom df = 36547, p-value = 7.705e-07
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 1.066612 1.162879
## sample estimates:
## ratio of variances
             1.113297
var.test(bank int$bank month[bank int$bank y=="1"],bank int$bank month[bank i
nt$bank y=="0"])
##
## F test to compare two variances
## data: bank int$bank month[bank int$bank y == "1"] and
bank_int$bank_month[bank_int$bank_y == "0"]
## F = 1.4489, num df = 4639, denom df = 36547, p-value < 2.2e-16
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 1.388178 1.513469
## sample estimates:
## ratio of variances
##
             1.448939
var.test(bank int$bank days[bank int$bank y=="1"],bank int$bank days[bank int
$bank_y=="0"])
```

```
##
## F test to compare two variances
## data: bank int$bank days[bank int$bank y == "1"] and
bank_int$bank_days[bank_int$bank_y == "0"]
## F = 0.94262, num df = 4639, denom df = 36547, p-value = 0.007934
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 0.9030892 0.9845977
## sample estimates:
## ratio of variances
##
            0.9426177
var.test(bank_int$bank_contact[bank_int$bank_y=="1"],bank_int$bank_contact[ba
nk int$bank y=="0"])
##
## F test to compare two variances
## data: bank_int$bank_contact[bank_int$bank_y == "1"] and
bank int$bank contact[bank int$bank y == "0"]
## F = 0.59209, num df = 4639, denom df = 36547, p-value < 2.2e-16
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 0.5672626 0.6184610
## sample estimates:
## ratio of variances
##
            0.5920918
var.test(bank_int$bank_marital[bank_int$bank_y=="1"],bank_int$bank_marital[ba
nk int$bank y=="0"])
##
## F test to compare two variances
## data: bank int$bank marital[bank int$bank y == "1"] and
bank_int$bank_marital[bank_int$bank_y == "0"]
## F = 0.95784, num df = 4639, denom df = 36547, p-value = 0.05265
## alternative hypothesis: true ratio of variances is not equal to 1
## 95 percent confidence interval:
## 0.9176693 1.0004937
## sample estimates:
## ratio of variances
##
            0.9578359
# Leverne test is used to verify Homoscedasticity. It tests if the variance
of two samples are # #equal. Levene's test is an inferential statistic used
to assess the equality of variances for a #variable calculated for two or
more groups.[1] Some common statistical procedures assume that #variances of
the populations from which different samples are drawn are equal. Levene's
test #assesses this assumption.
```

```
bank_int$y=bank$y
library(car)
## Warning: package 'car' was built under R version 3.5.2
## Loading required package: carData
## Warning: package 'carData' was built under R version 3.5.2
leveneTest(age ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value
                         Pr(>F)
## group
           1 689.32 < 2.2e-16 ***
##
        41186
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
#leveneTest() produces a two-sided test
leveneTest(duration ~ y, data=bank int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value
                        Pr(>F)
                 3130 < 2.2e-16 ***
           1
## group
        41186
##
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
leveneTest(campaign ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value
                         Pr(>F)
           1 127.71 < 2.2e-16 ***
## group
##
        41186
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
leveneTest(pdays ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
##
           Df F value
                      Pr(>F)
## group
           1 4861.2 < 2.2e-16 ***
        41186
##
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
leveneTest(previous ~ y, data=bank int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value
                        Pr(>F)
           1 2304.3 < 2.2e-16 ***
## group
## 41186
```

```
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
leveneTest(emp.var.rate ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value
                        Pr(>F)
          1 26.155 3.165e-07 ***
## group
        41186
##
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
leveneTest(cons.conf.idx ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value Pr(>F)
## group
           1 1048.5 < 2.2e-16 ***
       41186
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
leveneTest(cons.price.idx ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
          Df F value Pr(>F)
## group
         1 237.42 < 2.2e-16 ***
        41186
##
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
leveneTest(euribor3m ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value
                        Pr(>F)
## group 1 23.775 1.087e-06 ***
       41186
##
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
leveneTest(nr.employed ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value
                        Pr(>F)
                 1038 < 2.2e-16 ***
            1
## group
        41186
##
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
leveneTest(bank_housing ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
## Df F value Pr(>F)
```

```
## group 1 5.6802 0.01716 *
##
        41186
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
leveneTest(bank_loan ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value Pr(>F)
           1 0.8215 0.3647
## group
##
        41186
leveneTest(bank_job ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value
##
                        Pr(>F)
## group
           1
                233.1 < 2.2e-16 ***
        41186
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
leveneTest(bank_education ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
          Df F value Pr(>F)
## group
          1 0.1642 0.6853
        41186
##
leveneTest(bank month ~ y, data=bank int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value
                       Pr(>F)
           1 428.11 < 2.2e-16 ***
## group
##
       41186
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
leveneTest(bank days ~ y, data=bank int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value
                        Pr(>F)
           1 14.283 0.0001575 ***
## group
       41186
##
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
leveneTest(bank_contact ~ y, data=bank_int)
## Levene's Test for Homogeneity of Variance (center = median)
           Df F value
                        Pr(>F)
            1 881.71 < 2.2e-16 ***
## group
      41186
##
```

```
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1

leveneTest(bank_marital ~ y, data=bank_int)

## Levene's Test for Homogeneity of Variance (center = median)
## Df F value Pr(>F)
## group 1 28.513 9.358e-08 ***

## 41186
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
For this Data we don't need to standardize, therefore we have not applied scale function
```