## TP 3

## TP 3

```
df <- read.table(file="../../data/INFARCTUS.txt", header=TRUE, sep="", stringsAsFactors=FALSE)
head(df)
     Obs C PRONO FRCAR INCAR INSYS PRDIA PAPUL PVENT REPUL
## 1
       1 2 SURVIE
                      90
                          1.71
                                 19.0
                                         16
                                              19.5
                                                    16.0
                                                            912
##
       2 1
            DECES
                      90
                          1.68
                                 18.7
                                         24
                                              31.0
                                                    14.0
                                                           1476
##
       3 1
                     120
                                         23
                                              29.0
                                                           1657
            DECES
                          1.40
                                 11.7
                                                     8.0
       4 2 SURVIE
                      82
                          1.79
                                 21.8
                                         14
                                              17.5
                                                    10.0
                                                            782
## 5
            DECES
                                                    18.5
       5 1
                      80
                          1.58
                                 19.7
                                         21
                                              28.0
                                                           1418
## 6
       6 1
            DECES
                      80
                          1.13
                                 14.1
                                         18
                                              23.5
                                                     9.0
                                                           1664
```

### 1. ACP (selectionner les variables)

(a) Selection des variables

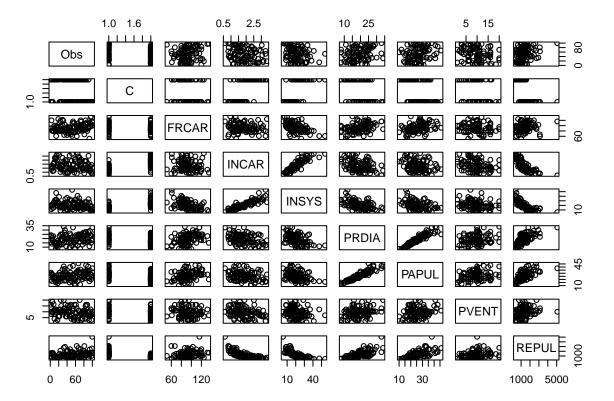
```
Xquanti <- df[, sapply(df, is.numeric)]
Xquanti</pre>
```

```
Obs C FRCAR INCAR INSYS PRDIA PAPUL PVENT REPUL
##
## 1
                             19.0
                                   16.0
                                          19.5
## 2
          2 1
                 90
                      1.68
                            18.7
                                   24.0
                                          31.0
                                                 14.0
                                                       1476
##
          3 1
                120
                      1.40
                            11.7
                                   23.0
                                          29.0
                                                  8.0
                                                       1657
## 4
          4 2
                 82
                      1.79
                            21.8
                                   14.0
                                          17.5
                                                 10.0
                                                         782
          5 1
                            19.7
                                   21.0
                                          28.0
                                                 18.5
                 80
                      1.58
                                                       1418
## 6
          6 1
                      1.13
                            14.1
                                   18.0
                                          23.5
                                                  9.0
                                                       1664
                 80
  7
          7 2
                            21.7
                                   23.0
                                          27.0
                                                 10.0
##
                 94
                      2.04
                                                       1059
         8 2
## 8
                 80
                      1.19
                            14.9
                                   16.0
                                          21.0
                                                 16.5
                                                        1412
## 9
          9 2
                 78
                      2.16
                            27.7
                                   15.0
                                          20.5
                                                 11.5
                                                         759
        10 2
                      2.28
                            22.8
## 10
                100
                                   16.0
                                          23.0
                                                  4.0
                                                         807
##
  11
        11 2
                 90
                      2.79
                            31.0
                                   16.0
                                          25.0
                                                  8.0
                                                         717
##
  12
        12 2
                      2.70
                            31.4
                                   15.0
                                          23.0
                                                  9.5
                 86
                                                         681
##
  13
        13 2
                      2.61
                            32.6
                                    8.0
                                          15.0
                                                  1.0
                                                         460
                 80
##
   14
        14 2
                      2.84
                            47.3
                                   11.0
                                          17.0
                                                 12.0
                                                         479
##
  15
        15 2
                      3.12
                            31.8
                                   15.0
                                                 11.0
                 99
                                          20.0
                                                         513
## 16
        16 2
                      2.47
                            26.8
                                   12.0
                                          19.0
                                                 11.0
                                                         615
## 17
        17 2
                      1.88
                            19.6
                                   12.0
                                          19.0
                                                  3.0
                                                         809
                 96
## 18
        18 2
                 86
                      1.70
                            19.8
                                   10.0
                                          14.0
                                                 10.5
                                                         659
## 19
                            26.9
                                   18.0
                                          28.0
                                                  6.0
        19 2
                125
                      3.37
                                                         665
## 20
        20 2
                      2.01
                            25.0
                                   15.0
                                          20.0
                                                  6.0
                                                         796
                            38.4
## 21
        21 2
                 82
                     3.15
                                   13.0
                                          20.0
                                                  6.0
                                                         508
```

```
## 22
         22 1
                 110
                      1.66
                             15.1
                                   23.0
                                          31.0
                                                  6.5
                                                        1494
## 23
         23 1
                             18.7
                                   13.0
                                                         907
                 80
                      1.50
                                          17.0
                                                 12.0
##
  24
         24 1
                 118
                      1.03
                              8.7
                                    19.0
                                          27.0
                                                 10.0
                                                        2097
## 25
         25 1
                 95
                      1.89
                             19.9
                                    25.0
                                          27.0
                                                 20.0
                                                        1143
## 26
         26 1
                 80
                      1.45
                             18.1
                                    19.0
                                          23.0
                                                 15.0
                                                        1269
## 27
                      1.30
                             15.1
                                   13.0
                                          18.0
                                                 10.0
         27 1
                 85
                                                        1108
## 28
         28 1
                 105
                      1.84
                             17.5
                                   18.0
                                          22.0
                                                 10.0
                                                         957
                             22.9
                                    25.0
## 29
         29 2
                 122
                      2.79
                                          36.0
                                                 10.0
                                                        1032
## 30
         30 2
                 81
                      1.77
                             21.9
                                    18.0
                                          27.0
                                                 11.0
                                                        1220
##
  31
         31 2
                 118
                      2.31
                             19.6
                                    22.0
                                          27.0
                                                 10.0
                                                         935
##
   32
         32 1
                 87
                      1.20
                             13.8
                                    34.0
                                          41.0
                                                 20.0
                                                        2733
##
                      1.19
                             18.3
                                    15.0
                                          18.0
                                                 13.0
                                                        1210
   33
         33 1
                  65
##
   34
         34 2
                 84
                      2.15
                             25.6
                                    27.0
                                          37.0
                                                 10.0
                                                        1377
                      0.91
                                    30.0
                                           33.5
                                                 10.0
                                                        2945
## 35
         35 1
                 103
                              8.8
##
  36
         36 2
                      2.54
                             33.9
                                    24.0
                                           31.0
                                                 16.0
                                                         976
                  75
##
  37
         37 2
                  90
                      2.08
                             23.1
                                    20.0
                                          28.0
                                                  6.0
                                                        1077
                      1.93
                             21.4
                                                 10.0
                                                         746
## 38
         38 2
                  90
                                   11.0
                                          18.0
##
  39
         39 1
                  90
                      0.95
                             10.6
                                    20.0
                                          24.0
                                                  6.0
                                                        2021
                      2.38
                             36.6
## 40
                                   16.0
                                          22.0
                                                 12.0
                                                         739
         40 2
                  65
## 41
         41 1
                  95
                      0.99
                             10.4
                                    20.0
                                          27.5
                                                  8.0
                                                        2222
## 42
         42 1
                  95
                      0.85
                              8.9
                                   19.0
                                          22.0
                                                 15.5
                                                        2071
## 43
         43 2
                  86
                      2.05
                             23.8
                                    21.0
                                          28.0
                                                 10.0
                                                        1093
         44 2
                      2.02
                             24.6
                                   16.0
                                          22.0
                                                 14.0
## 44
                  82
                                                         871
                                          26.5
         45 1
                             20.6
                                   19.0
                                                 11.0
                                                        1472
## 45
                  70
                      1.44
         46 2
## 46
                  92
                      3.06
                             33.3
                                   10.0
                                          15.0
                                                  6.0
                                                         392
## 47
         47 1
                  94
                      1.31
                             13.9
                                    26.0
                                          40.0
                                                 15.0
                                                        2443
##
                  79
                      1.29
                             16.3
                                    24.0
                                          31.0
                                                 10.0
                                                        1922
  48
         48 1
##
  49
         49 2
                  67
                      1.47
                             21.9
                                    15.0
                                          18.0
                                                 16.0
                                                         980
## 50
         50 1
                  75
                      1.21
                             16.1
                                    19.0
                                          24.0
                                                  4.0
                                                        1587
## 51
         51 2
                  80
                      2.41
                             30.9
                                    19.0
                                          24.0
                                                  7.0
                                                         797
## 52
         52 2
                  61
                      3.28
                             54.0
                                    12.0
                                          16.0
                                                  7.0
                                                         390
## 53
         53 1
                 110
                      1.24
                             11.3
                                    22.0
                                          27.5
                                                 11.0
                                                        1774
## 54
         54 1
                 116
                      1.85
                             15.9
                                    33.0
                                          42.0
                                                 13.0
                                                        1816
                      2.00
                             26.7
                                    16.0
                                          22.0
                                                  5.0
                                                         880
## 55
         55 2
                 75
## 56
         56 1
                 92
                      1.97
                             21.4
                                    18.0
                                          27.0
                                                  3.0
                                                        1096
## 57
         57 2
                      0.96
                              8.8
                                    15.0
                                          19.0
                 110
                                                 16.0
                                                        1583
## 58
         58 2
                 95
                      2.56
                             26.9
                                     8.0
                                          13.0
                                                  3.0
                                                         406
## 59
         59 2
                  75
                      2.32
                             30.9
                                     8.0
                                          10.0
                                                  6.0
                                                         345
## 60
         60 2
                 80
                      2.65
                             33.1
                                   13.0
                                          19.0
                                                  9.0
                                                         574
         61 1
                 102
                      1.60
                             15.7
                                    24.0
                                                 16.0
                                                        1550
## 61
                                          31.0
                                    18.0
                                          23.0
                                                  8.5
##
  62
         62 2
                 86
                      1.67
                             19.4
                                                        1102
##
                      0.82
                             13.7
                                    22.0
                                          32.0
                                                 13.0
                                                        3122
  63
         63 1
                 60
##
  64
         64 2
                 100
                      1.76
                             17.6
                                    23.0
                                          33.0
                                                  2.0
                                                        1500
         65 2
                             41.0
##
  65
                 80
                      3.28
                                    12.0
                                          17.0
                                                  2.0
                                                         415
                                           35.0
                                                  6.5
## 66
         66 2
                 108
                      2.96
                             27.4
                                    24.0
                                                         946
                                    25.0
## 67
         67 1
                 92
                      1.37
                             14.8
                                          46.0
                                                 11.0
                                                        2686
## 68
         68 1
                 100
                      1.38
                             13.8
                                    20.0
                                          31.0
                                                 11.0
                                                        1797
                      2.85
                             35.6
                                    25.0
                                          32.0
                                                         898
## 69
         69 2
                  80
                                                  7.0
## 70
         70 1
                  87
                      2.51
                             28.8
                                    16.0
                                          24.0
                                                 20.0
                                                         765
                             23.1
## 71
         71 2
                 100
                      2.31
                                     8.0
                                          12.0
                                                  1.0
                                                         416
## 72
                              9.9
                                    25.0
                                          36.0
         72 1
                 120
                      1.18
                                                  8.0
                                                        2441
## 73
         73 1
                 115
                      1.83
                             15.9
                                    25.0
                                          30.0
                                                  8.0
                                                        1311
                                          30.5
## 74
         74 2
                 101
                      2.55
                             25.2
                                   23.2
                                                  9.0
                                                         957
                             23.5
## 75
         75 2
                 92
                      2.17
                                   19.0
                                          24.0
                                                  3.0
                                                         885
```

```
## 76
        76 1
                     1.42
                            16.1
                                   20.0
                                         26.0
                                                10.0
                                                      1465
## 77
        77 2
                 80
                     1.59
                            19.9
                                   13.0
                                         20.5
                                                 4.0
                                                      1031
##
  78
                            16.7
                                   23.0
                                         32.5
                                                10.0
                                                      1769
        78 1
                     1.47
##
  79
        79 1
                     1.23
                            11.8
                                   27.0
                                         33.0
                                                11.0
                                                      2146
                104
##
   80
        80 2
                 90
                     1.45
                            16.1
                                   17.0
                                         24.0
                                                 8.5
                                                      1324
##
  81
        81 1
                 67
                     0.85
                            12.7
                                   26.0
                                         33.0
                                                11.0
                                                      3106
## 82
        82 2
                 87
                     2.37
                            27.2
                                   15.0
                                         22.0
                                                10.0
                                                        743
                            22.2
                                   26.0
## 83
        83 2
                     2.40
                                         31.0
                                                 4.0
                                                      1033
                108
##
  84
        84 1
                120
                     1.91
                            15.9
                                   18.0
                                         27.0
                                                15.0
                                                      1131
## 85
        85 1
                108
                     1.50
                            13.9
                                   28.0
                                         43.0
                                                16.0
                                                      1813
##
   86
        86 2
                 86
                     2.36
                            27.4
                                   24.0
                                          34.0
                                                 8.0
                                                      1153
                     1.56
                            13.9
                                   24.0
                                         29.0
                                                      1487
##
   87
        87 1
                112
                                                 4.0
   88
        88 1
                     1.34
                            17.0
                                   16.0
                                         25.0
                                                16.0
                                                      1493
##
                 80
## 89
        89 1
                 95
                     1.65
                            17.4
                                   20.0
                                         33.0
                                                 7.0
                                                      1600
                                                10.0
## 90
        90 1
                 90
                     2.04
                            22.7
                                   28.0
                                         41.0
                                                      1608
                            33.6
                                         23.5
                                                 7.0
## 91
        91 2
                 90
                     3.03
                                   17.0
                                                        620
## 92
        92 1
                 94
                     1.21
                            12.9
                                   17.0
                                         22.0
                                                 3.0
                                                      1455
                            26.3
                                   11.0
                                         17.0
                                                 6.0
                                                      1015
##
  93
        93 1
                 51
                     1.34
                110
                                   29.0
                                         35.0
                                                      2393
##
  94
        94 1
                     1.17
                            10.6
                                                10.5
   95
                                   24.0
                                         29.0
                                                 6.0
                                                      1333
##
        95 1
                 96
                     1.74
                            18.1
##
  96
        96 1
                132
                     1.31
                             9.9
                                   23.0
                                         28.0
                                                12.0
                                                      1710
## 97
        97 1
                135
                     0.95
                             7.0
                                   15.0
                                         20.0
                                                 7.0
                                                       1684
                     1.92
                            18.3
                                   18.0
                                         24.0
                                                 3.0
                                                      1000
## 98
        98 1
                105
## 99
        99 1
                 99
                     0.83
                             8.4
                                   23.0
                                         27.0
                                                 8.0
                                                      2602
## 100 100 1
                     0.60
                             5.2
                                   33.0
                                         38.0
                                                10.0
                                                      5067
                116
## 101 101 1
                112
                     1.54
                            13.8
                                   25.0
                                         31.0
                                                 8.0
                                                      1610
```

plot(Xquanti)



Xquanti <- Xquanti[,-c(1,2)]
Xquanti</pre>

```
FRCAR INCAR INSYS PRDIA PAPUL PVENT REPUL
##
                    19.0 16.0
                                 19.5
                                              912
## 1
          90
              1.71
                                       16.0
## 2
          90
              1.68
                    18.7
                           24.0
                                 31.0
                                       14.0
                                             1476
         120
## 3
              1.40
                          23.0
                                 29.0
                                        8.0
                                             1657
                    11.7
## 4
          82
              1.79
                    21.8
                          14.0
                                 17.5
                                       10.0
                                              782
## 5
          80
              1.58
                    19.7
                          21.0
                                 28.0
                                       18.5
                                             1418
## 6
          80
              1.13
                    14.1
                          18.0
                                 23.5
                                        9.0
                                             1664
                          23.0
                                 27.0
                                             1059
## 7
              2.04
                   21.7
                                       10.0
          94
## 8
              1.19
                    14.9
                          16.0
                                 21.0
                                       16.5
                                             1412
          80
## 9
          78
              2.16
                    27.7
                          15.0
                                 20.5
                                       11.5
                                              759
## 10
              2.28
                    22.8
                          16.0
                                 23.0
                                        4.0
                                              807
         100
          90
              2.79
                    31.0
                          16.0
                                 25.0
## 11
                                        8.0
                                              717
## 12
              2.70
                    31.4
                          15.0
                                 23.0
                                        9.5
                                              681
          86
              2.61
                    32.6
                                 15.0
                                        1.0
## 13
          80
                           8.0
                                              460
                    47.3
                          11.0
                                 17.0
                                       12.0
                                              479
## 14
          61
              2.84
## 15
                    31.8
                          15.0
                                 20.0
                                       11.0
                                              513
          99
              3.12
## 16
          92
              2.47
                    26.8
                          12.0
                                 19.0
                                       11.0
                                              615
                                 19.0
                                              809
## 17
          96
              1.88
                    19.6
                          12.0
                                        3.0
## 18
             1.70
                    19.8
                          10.0
                                 14.0
                                       10.5
                                              659
          86
## 19
         125
              3.37
                    26.9
                          18.0
                                 28.0
                                        6.0
                                              665
## 20
          80 2.01
                    25.0 15.0
                                 20.0
                                        6.0
                                              796
          82 3.15 38.4 13.0 20.0
## 21
                                        6.0
                                              508
```

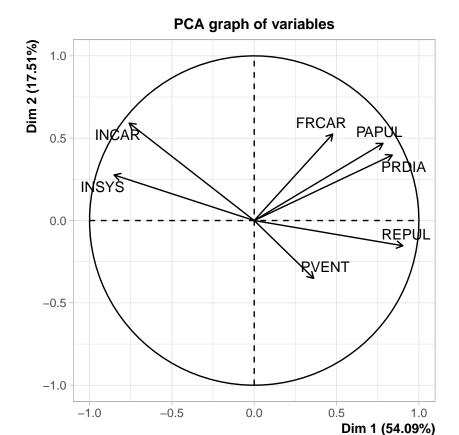
```
## 22
         110
               1.66 15.1
                            23.0 31.0
                                          6.5
                                                1494
## 23
                     18.7
                            13.0
                                   17.0
                                         12.0
                                                 907
          80
               1.50
## 24
         118
               1.03
                       8.7
                            19.0
                                   27.0
                                         10.0
                                                2097
## 25
          95
               1.89
                     19.9
                            25.0
                                   27.0
                                         20.0
                                                1143
## 26
          80
               1.45
                     18.1
                            19.0
                                   23.0
                                         15.0
                                                1269
## 27
               1.30
                     15.1
                            13.0
                                   18.0
                                         10.0
          85
                                                1108
               1.84
                     17.5
                                   22.0
                                         10.0
## 28
         105
                            18.0
                                                 957
               2.79
                     22.9
                            25.0
                                   36.0
## 29
         122
                                         10.0
                                                1032
## 30
          81
               1.77
                     21.9
                            18.0
                                   27.0
                                         11.0
                                                1220
                            22.0
## 31
         118
               2.31
                     19.6
                                   27.0
                                         10.0
                                                 935
## 32
          87
               1.20
                     13.8
                            34.0
                                   41.0
                                         20.0
                                                2733
## 33
                     18.3
                            15.0
                                   18.0
                                         13.0
                                                1210
           65
               1.19
## 34
          84
               2.15
                     25.6
                            27.0
                                   37.0
                                         10.0
                                                1377
               0.91
                                   33.5
## 35
         103
                       8.8
                            30.0
                                         10.0
                                                2945
## 36
          75
               2.54
                     33.9
                            24.0
                                   31.0
                                         16.0
                                                 976
## 37
          90
               2.08
                     23.1
                            20.0
                                   28.0
                                          6.0
                                                1077
## 38
                     21.4
                            11.0
                                   18.0
                                         10.0
                                                 746
           90
               1.93
## 39
           90
               0.95
                     10.6
                            20.0
                                   24.0
                                          6.0
                                                2021
                     36.6
## 40
               2.38
                            16.0
                                   22.0
                                         12.0
                                                 739
           65
## 41
           95
               0.99
                     10.4
                            20.0
                                   27.5
                                          8.0
                                                2222
## 42
           95
               0.85
                       8.9
                            19.0
                                   22.0
                                         15.5
                                                2071
## 43
           86
               2.05
                     23.8
                            21.0
                                   28.0
                                         10.0
                                                1093
                                   22.0
               2.02
                     24.6
                            16.0
                                         14.0
## 44
          82
                                                 871
                     20.6
                            19.0
                                   26.5
                                         11.0
                                                1472
## 45
          70
               1.44
                            10.0
                                   15.0
## 46
          92
               3.06
                     33.3
                                          6.0
                                                 392
## 47
          94
               1.31
                     13.9
                            26.0
                                   40.0
                                         15.0
                                                2443
## 48
          79
               1.29
                     16.3
                            24.0
                                   31.0
                                         10.0
                                                1922
                     21.9
## 49
           67
               1.47
                            15.0
                                   18.0
                                         16.0
                                                 980
## 50
          75
               1.21
                     16.1
                            19.0
                                   24.0
                                          4.0
                                                1587
## 51
           80
               2.41
                     30.9
                            19.0
                                   24.0
                                          7.0
                                                 797
               3.28
## 52
          61
                     54.0
                            12.0
                                   16.0
                                          7.0
                                                 390
## 53
         110
               1.24
                     11.3
                            22.0
                                   27.5
                                         11.0
                                                1774
                            33.0
## 54
         116
               1.85
                     15.9
                                   42.0
                                         13.0
                                                1816
                            16.0
                                          5.0
          75
               2.00
                     26.7
                                   22.0
                                                 880
## 55
## 56
          92
               1.97
                     21.4
                            18.0
                                   27.0
                                          3.0
                                                1096
         110
## 57
               0.96
                       8.8
                            15.0
                                   19.0
                                         16.0
                                                1583
## 58
          95
               2.56
                     26.9
                             8.0
                                   13.0
                                          3.0
                                                 406
## 59
          75
               2.32
                     30.9
                             8.0
                                   10.0
                                          6.0
                                                 345
## 60
          80
               2.65
                     33.1
                            13.0
                                   19.0
                                          9.0
                                                 574
         102
               1.60
                     15.7
                            24.0
                                   31.0
                                         16.0
                                                1550
## 61
                            18.0
                                   23.0
                                          8.5
                                                1102
## 62
          86
               1.67
                     19.4
## 63
          60
               0.82
                     13.7
                            22.0
                                   32.0
                                         13.0
                                                3122
## 64
         100
               1.76
                     17.6
                            23.0
                                   33.0
                                          2.0
                                                1500
## 65
          80
               3.28
                     41.0
                            12.0
                                   17.0
                                          2.0
                                                 415
                                   35.0
## 66
         108
               2.96
                     27.4
                            24.0
                                          6.5
                                                 946
                            25.0
## 67
          92
               1.37
                     14.8
                                   46.0
                                         11.0
                                                2686
## 68
         100
               1.38
                     13.8
                            20.0
                                   31.0
                                         11.0
                                                1797
                     35.6
                            25.0
                                   32.0
                                                 898
## 69
          80
               2.85
                                          7.0
## 70
          87
               2.51
                     28.8
                            16.0
                                   24.0
                                         20.0
                                                 765
## 71
         100
               2.31
                     23.1
                             8.0
                                   12.0
                                          1.0
                                                 416
## 72
         120
               1.18
                       9.9
                            25.0
                                   36.0
                                          8.0
                                                2441
## 73
         115
              1.83
                     15.9
                            25.0
                                   30.0
                                          8.0
                                                1311
## 74
         101
              2.55
                     25.2
                            23.2
                                   30.5
                                          9.0
                                                 957
## 75
          92 2.17 23.5 19.0
                                   24.0
                                          3.0
                                                 885
```

```
## 76
          87 1.42 16.1
                          20.0 26.0 10.0
                                             1465
## 77
          80
              1.59
                    19.9
                          13.0
                                 20.5
                                        4.0
                                             1031
## 78
              1.47
                    16.7
                           23.0
                                 32.5
                                       10.0
                                             1769
          88
## 79
              1.23
                    11.8
                           27.0
                                 33.0
                                       11.0
                                             2146
         104
## 80
          90
              1.45
                    16.1
                           17.0
                                 24.0
                                        8.5
                                              1324
## 81
          67
              0.85
                    12.7
                           26.0
                                 33.0
                                       11.0
                                             3106
## 82
          87
              2.37
                    27.2
                          15.0
                                 22.0
                                       10.0
                                               743
## 83
              2.40
                    22.2
                           26.0
                                 31.0
                                        4.0
                                             1033
         108
## 84
         120
              1.91
                    15.9
                           18.0
                                 27.0
                                       15.0
                                             1131
                           28.0
## 85
         108
              1.50
                    13.9
                                 43.0
                                       16.0
                                             1813
## 86
          86
              2.36
                    27.4
                           24.0
                                 34.0
                                        8.0
                                             1153
                    13.9
                           24.0
                                 29.0
                                             1487
## 87
         112
              1.56
                                        4.0
## 88
              1.34
                    17.0
                          16.0
                                 25.0
                                             1493
          80
                                       16.0
                                 33.0
                                             1600
## 89
          95
              1.65
                    17.4
                           20.0
                                        7.0
## 90
          90
              2.04
                    22.7
                           28.0
                                 41.0
                                       10.0
                                             1608
## 91
          90
              3.03
                    33.6
                          17.0
                                 23.5
                                        7.0
                                              620
## 92
          94
              1.21
                    12.9 17.0
                                 22.0
                                        3.0
                                             1455
## 93
                    26.3
                          11.0
                                 17.0
                                        6.0
                                             1015
          51
              1.34
                                 35.0
                                             2393
## 94
         110
              1.17
                    10.6
                          29.0
                                       10.5
## 95
                                 29.0
                                             1333
          96
              1.74
                    18.1
                           24.0
                                        6.0
                                       12.0
## 96
         132
              1.31
                      9.9
                           23.0
                                 28.0
                                             1710
## 97
         135
              0.95
                      7.0
                           15.0
                                 20.0
                                        7.0
                                              1684
                           18.0
                                 24.0
                                             1000
## 98
         105
              1.92
                    18.3
                                        3.0
## 99
          99
              0.83
                      8.4
                           23.0
                                 27.0
                                        8.0
                                             2602
## 100
              0.60
                      5.2
                           33.0
                                 38.0
                                       10.0
                                             5067
         116
## 101
         112
              1.54
                    13.8
                           25.0
                                 31.0
                                        8.0
                                             1610
```

### library(FactoMineR)

```
res <- PCA(Xquanti)</pre>
```

## PCA graph of individuals Dim 2 (17.51%) 19 66 54 69 21 15 46 13 58 60 65 52 100 0 -3532 1**4** 59° -2 93 -4 Ó Dim 1 (54.09%)



## 2. Utiliser les qualitatives

```
X <- df[,-1]
X[, 1] <- as.character(X[, 1])
X</pre>
```

```
C PRONO FRCAR INCAR INSYS PRDIA PAPUL PVENT REPUL
##
       2 SURVIE
                        1.71
                               19.0
                                     16.0
                                           19.5
                                                  16.0
                                                          912
## 2
          DECES
                    90
                        1.68
                               18.7
                                     24.0
                                           31.0
                                                  14.0
                                                        1476
       1
## 3
          DECES
                        1.40
                               11.7
                                     23.0
                                           29.0
                                                   8.0
                                                        1657
       1
                   120
                                                  10.0
## 4
       2 SURVIE
                    82
                        1.79
                               21.8
                                     14.0
                                           17.5
                                                          782
## 5
       1
          DECES
                    80
                        1.58
                               19.7
                                     21.0
                                           28.0
                                                  18.5
                                                        1418
                               14.1
                                     18.0
                                           23.5
## 6
          DECES
                    80
                        1.13
                                                   9.0
                                                        1664
       1
                        2.04
                               21.7
                                     23.0
                                           27.0
                                                  10.0
## 7
       2 SURVIE
                    94
                                                        1059
## 8
       2 SURVIE
                        1.19
                               14.9
                                     16.0
                                           21.0
                                                  16.5
                                                         1412
                    80
## 9
       2 SURVIE
                    78
                        2.16
                               27.7
                                     15.0
                                           20.5
                                                  11.5
                                                         759
## 10
       2 SURVIE
                   100
                        2.28
                               22.8
                                     16.0
                                           23.0
                                                   4.0
                                                          807
## 11
                    90
                        2.79
                               31.0
                                     16.0
                                           25.0
                                                   8.0
                                                          717
       2 SURVIE
## 12
       2 SURVIE
                    86
                        2.70
                               31.4
                                     15.0
                                           23.0
                                                   9.5
                                                          681
## 13
       2 SURVIE
                        2.61
                               32.6
                                      8.0
                                           15.0
                                                   1.0
                                                          460
                    80
                               47.3
## 14
       2 SURVIE
                    61
                        2.84
                                     11.0
                                           17.0
                                                  12.0
                                                          479
## 15
                    99
                        3.12
                               31.8
                                     15.0
                                           20.0
                                                  11.0
       2 SURVIE
                                                         513
## 16
       2 SURVIE
                    92
                        2.47
                               26.8
                                     12.0
                                           19.0
                                                  11.0
                                                          615
                        1.88 19.6
                                    12.0
       2 SURVIE
                    96
                                           19.0
                                                   3.0
                                                          809
## 17
```

```
## 18
       2 SURVIE
                     86
                          1.70
                                 19.8
                                       10.0
                                             14.0
                                                     10.5
                                                              659
## 19
                                              28.0
                                                      6.0
       2 SURVIE
                                 26.9
                                                             665
                    125
                          3.37
                                        18.0
##
   20
       2 SURVIE
                     80
                          2.01
                                 25.0
                                        15.0
                                               20.0
                                                       6.0
                                                             796
       2 SURVIE
                          3.15
                                 38.4
                                        13.0
                                               20.0
                                                       6.0
                                                             508
##
  21
                     82
##
   22
        1
           DECES
                    110
                          1.66
                                 15.1
                                        23.0
                                               31.0
                                                       6.5
                                                            1494
           DECES
                                        13.0
                                              17.0
                                                     12.0
                                                             907
##
   23
        1
                     80
                          1.50
                                 18.7
           DECES
                                                     10.0
##
  24
        1
                    118
                          1.03
                                  8.7
                                        19.0
                                               27.0
                                                            2097
           DECES
                                               27.0
##
  25
        1
                     95
                          1.89
                                 19.9
                                        25.0
                                                     20.0
                                                            1143
##
   26
        1
           DECES
                     80
                          1.45
                                 18.1
                                        19.0
                                               23.0
                                                     15.0
                                                            1269
##
   27
        1
           DECES
                     85
                          1.30
                                 15.1
                                        13.0
                                               18.0
                                                     10.0
                                                            1108
##
   28
       1
           DECES
                    105
                          1.84
                                 17.5
                                        18.0
                                               22.0
                                                     10.0
                                                             957
        2 SURVIE
                          2.79
                                 22.9
                                        25.0
                                               36.0
                                                     10.0
                                                            1032
##
   29
                    122
##
   30
       2 SURVIE
                     81
                          1.77
                                 21.9
                                        18.0
                                               27.0
                                                     11.0
                                                            1220
                          2.31
                                               27.0
                                                     10.0
##
   31
        2 SURVIE
                    118
                                 19.6
                                        22.0
                                                             935
           DECES
                          1.20
                                 13.8
                                        34.0
                                               41.0
                                                     20.0
                                                            2733
##
   32
        1
                     87
##
   33
        1
           DECES
                     65
                          1.19
                                 18.3
                                        15.0
                                               18.0
                                                     13.0
                                                            1210
        2 SURVIE
                                 25.6
                                        27.0
                                               37.0
                                                     10.0
##
   34
                     84
                          2.15
                                                            1377
##
   35
           DECES
                    103
                          0.91
                                  8.8
                                        30.0
                                               33.5
                                                     10.0
                                                            2945
       1
                                 33.9
       2 SURVIE
                          2.54
                                        24.0
                                               31.0
                                                             976
##
   36
                     75
                                                     16.0
##
   37
        2 SURVIE
                     90
                          2.08
                                 23.1
                                        20.0
                                               28.0
                                                      6.0
                                                            1077
##
   38
       2 SURVIE
                     90
                          1.93
                                 21.4
                                        11.0
                                               18.0
                                                     10.0
                                                             746
   39
           DECES
                          0.95
                                 10.6
                                        20.0
                                               24.0
                                                       6.0
                                                            2021
##
        1
                     90
       2 SURVIE
                                 36.6
                                        16.0
                                               22.0
                                                             739
##
  40
                     65
                          2.38
                                                     12.0
           DECES
                                 10.4
                                        20.0
                                               27.5
                                                            2222
##
  41
        1
                     95
                          0.99
                                                      8.0
## 42
       1
           DECES
                     95
                          0.85
                                  8.9
                                        19.0
                                              22.0
                                                     15.5
                                                            2071
##
   43
       2 SURVIE
                     86
                          2.05
                                 23.8
                                        21.0
                                               28.0
                                                     10.0
                                                            1093
        2 SURVIE
                          2.02
                                 24.6
                                        16.0
                                               22.0
                                                     14.0
                                                             871
##
   44
                     82
           DECES
##
   45
        1
                     70
                          1.44
                                 20.6
                                        19.0
                                               26.5
                                                     11.0
                                                            1472
        2 SURVIE
                          3.06
                                 33.3
                                        10.0
                                               15.0
                                                       6.0
                                                             392
##
   46
                     92
##
   47
        1
           DECES
                          1.31
                                 13.9
                                        26.0
                                               40.0
                                                     15.0
                                                            2443
                     94
##
   48
        1
           DECES
                     79
                          1.29
                                 16.3
                                        24.0
                                               31.0
                                                     10.0
                                                            1922
##
   49
        2 SURVIE
                     67
                          1.47
                                 21.9
                                        15.0
                                               18.0
                                                     16.0
                                                             980
##
   50
        1
           DECES
                     75
                          1.21
                                 16.1
                                        19.0
                                               24.0
                                                       4.0
                                                            1587
       2 SURVIE
                          2.41
                                 30.9
                                        19.0
                                               24.0
                                                       7.0
                                                             797
##
   51
                     80
##
   52
        2 SURVIE
                     61
                          3.28
                                 54.0
                                        12.0
                                               16.0
                                                      7.0
                                                             390
           DECES
                                 11.3
                                        22.0
                                              27.5
                                                     11.0
##
   53
       1
                    110
                          1.24
                                                            1774
##
   54
        1
           DECES
                    116
                          1.85
                                 15.9
                                        33.0
                                               42.0
                                                     13.0
                                                            1816
       2 SURVIE
                     75
                          2.00
                                 26.7
                                        16.0
                                               22.0
                                                       5.0
                                                             880
##
  55
        1
           DECES
                     92
                          1.97
                                 21.4
                                        18.0
                                               27.0
                                                       3.0
                                                            1096
##
   56
       2 SURVIE
                          0.96
                                  8.8
                                        15.0
                                               19.0
                                                     16.0
                                                            1583
##
   57
                    110
                                 26.9
       2 SURVIE
                          2.56
                                         8.0
                                               13.0
                                                             406
##
   58
                     95
                                                       3.0
       2 SURVIE
                     75
                          2.32
                                 30.9
                                         8.0
                                               10.0
                                                       6.0
                                                             345
##
   59
##
   60
        2 SURVIE
                     80
                          2.65
                                 33.1
                                        13.0
                                               19.0
                                                      9.0
                                                             574
           DECES
                    102
                          1.60
                                 15.7
                                        24.0
                                               31.0
                                                     16.0
                                                            1550
##
   61
        1
        2 SURVIE
                                                       8.5
##
  62
                     86
                          1.67
                                 19.4
                                        18.0
                                               23.0
                                                            1102
           DECES
                          0.82
                                 13.7
                                        22.0
                                               32.0
                                                     13.0
                                                            3122
## 63
        1
                     60
##
   64
       2 SURVIE
                    100
                          1.76
                                 17.6
                                        23.0
                                               33.0
                                                       2.0
                                                            1500
                                        12.0
                                               17.0
                                                       2.0
##
   65
       2 SURVIE
                     80
                          3.28
                                 41.0
                                                             415
##
   66
       2 SURVIE
                    108
                          2.96
                                 27.4
                                        24.0
                                               35.0
                                                       6.5
                                                             946
##
   67
           DECES
                     92
                          1.37
                                 14.8
                                        25.0
                                               46.0
                                                     11.0
                                                            2686
        1
           DECES
                          1.38
                                 13.8
                                                     11.0
##
   68
        1
                    100
                                        20.0
                                               31.0
                                                            1797
##
   69
        2 SURVIE
                     80
                          2.85
                                 35.6
                                        25.0
                                               32.0
                                                       7.0
                                                             898
## 70
        1
           DECES
                     87
                          2.51
                                 28.8
                                        16.0
                                               24.0
                                                     20.0
                                                             765
## 71
       2 SURVIE
                    100
                          2.31
                                 23.1
                                         8.0
                                              12.0
                                                       1.0
                                                             416
```

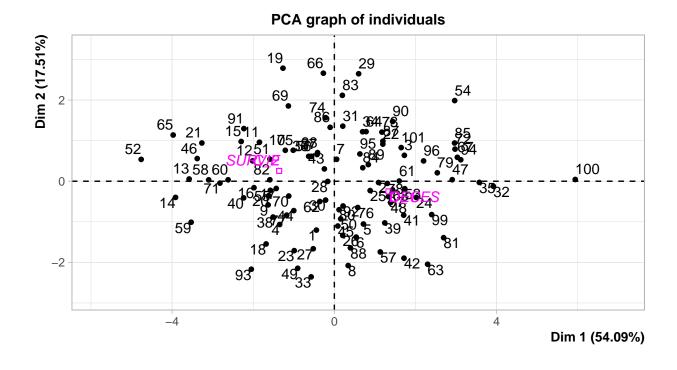
```
25.0
## 72
       1 DECES
                    120
                         1.18
                                  9.9
                                              36.0
                                                      8.0
                                                            2441
                                              30.0
## 73
       1 DECES
                    115
                          1.83
                                15.9
                                       25.0
                                                      8.0
                                                            1311
                                                             957
##
   74
       2 SURVIE
                    101
                          2.55
                                 25.2
                                       23.2
                                              30.5
                                                      9.0
       2 SURVIE
                                       19.0
                                              24.0
                                                             885
##
   75
                     92
                          2.17
                                 23.5
                                                      3.0
##
   76
       1
           DECES
                     87
                          1.42
                                16.1
                                       20.0
                                              26.0
                                                     10.0
                                                            1465
       2 SURVIE
                     80
                          1.59
                                 19.9
                                       13.0
                                              20.5
                                                      4.0
                                                            1031
##
   77
           DECES
                          1.47
                                 16.7
                                       23.0
                                              32.5
                                                     10.0
                                                            1769
##
   78
       1
                     88
                                                            2146
           DECES
                          1.23
                                       27.0
                                              33.0
                                                     11.0
## 79
       1
                    104
                                11.8
##
   80
       2 SURVIE
                     90
                          1.45
                                16.1
                                       17.0
                                              24.0
                                                      8.5
                                                            1324
##
          DECES
                          0.85
                                12.7
                                       26.0
                                              33.0
                                                     11.0
                                                            3106
   81
       1
                     67
##
   82
       2 SURVIE
                     87
                          2.37
                                 27.2
                                       15.0
                                              22.0
                                                     10.0
                                                             743
       2 SURVIE
                          2.40
                                22.2
                                       26.0
                                                            1033
##
   83
                    108
                                              31.0
                                                      4.0
          DECES
                                              27.0
##
   84
       1
                    120
                          1.91
                                15.9
                                       18.0
                                                     15.0
                                                            1131
           DECES
                          1.50
                                 13.9
                                       28.0
                                              43.0
                                                     16.0
                                                            1813
##
   85
       1
                    108
                                                            1153
##
   86
       2 SURVIE
                          2.36
                                27.4
                                       24.0
                                              34.0
                                                      8.0
                     86
##
   87
       1
           DECES
                    112
                          1.56
                                13.9
                                       24.0
                                              29.0
                                                      4.0
                                                            1487
##
           DECES
                     80
                          1.34
                                17.0
                                       16.0
                                              25.0
                                                     16.0
                                                            1493
   88
       1
           DECES
                                       20.0
##
   89
       1
                     95
                          1.65
                                17.4
                                              33.0
                                                      7.0
                                                            1600
##
           DECES
                          2.04
                                22.7
                                       28.0
                                              41.0
                                                     10.0
                                                            1608
   90
       1
                     90
                                       17.0
                                                      7.0
                                                             620
##
   91
       2 SURVIE
                     90
                          3.03
                                33.6
                                              23.5
##
   92
       1
           DECES
                     94
                          1.21
                                 12.9
                                       17.0
                                              22.0
                                                      3.0
                                                            1455
##
   93
       1
           DECES
                     51
                          1.34
                                 26.3
                                       11.0
                                              17.0
                                                      6.0
                                                            1015
                                 10.6
                                       29.0
           DECES
                          1.17
                                              35.0
                                                     10.5
                                                            2393
##
  94
       1
                    110
##
   95
       1
           DECES
                     96
                          1.74
                                18.1
                                       24.0
                                              29.0
                                                      6.0
                                                            1333
                                  9.9
                                       23.0
                                              28.0
                                                     12.0
                                                            1710
##
  96
       1
           DECES
                    132
                          1.31
##
   97
       1
           DECES
                    135
                          0.95
                                  7.0
                                       15.0
                                              20.0
                                                      7.0
                                                            1684
##
   98
           DECES
                    105
                          1.92
                                 18.3
                                       18.0
                                              24.0
                                                      3.0
                                                            1000
       1
  99
           DECES
                     99
                          0.83
                                  8.4
                                       23.0
                                              27.0
                                                      8.0
                                                            2602
##
       1
## 100 1
           DECES
                    116
                          0.60
                                  5.2
                                       33.0
                                              38.0
                                                     10.0
                                                            5067
           DECES
## 101 1
                    112
                          1.54
                                13.8
                                       25.0
                                              31.0
                                                      8.0
                                                            1610
```

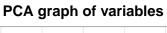
```
quali_indice <- c(1,2)
X[,quali_indice]</pre>
```

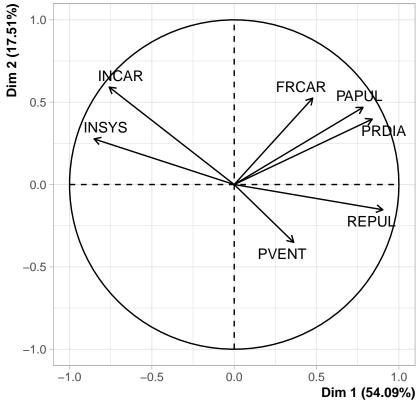
```
PRONO
##
       C
## 1
       2 SURVIE
## 2
          DECES
       1
##
          DECES
   3
       1
##
       2 SURVIE
   4
          DECES
## 5
       1
## 6
       1
          DECES
##
  7
       2 SURVIE
## 8
       2 SURVIE
##
  9
       2 SURVIE
       2 SURVIE
## 10
##
       2 SURVIE
   11
##
   12
       2 SURVIE
##
   13
       2 SURVIE
##
   14
       2 SURVIE
       2 SURVIE
## 15
## 16
       2 SURVIE
## 17
       2 SURVIE
  18
       2 SURVIE
       2 SURVIE
## 19
```

- ## 20 2 SURVIE
- ## 21 2 SURVIE
- ## 22 DECES 1
- ## 23 **DECES** 1
- ## 24 1
- **DECES**
- ## 25 1 **DECES** ## 26 1
- **DECES** ## 27 DECES 1
- ## 28 1 DECES
- ## 29
- 2 SURVIE
- ## 30 2 SURVIE
- 2 SURVIE ## 31
- ## 32 DECES 1
- ## 33 1 **DECES**
- ## 34 2 SURVIE
- ## 35 1 DECES
- ## 36 2 SURVIE
- 2 SURVIE 37 ##
- ## 38 2 SURVIE
- ## 39 1 DECES
- ## 40 2 SURVIE
- ## 41 1 **DECES**
- ## 42 1 DECES
- ## 43 2 SURVIE
- ## 44 2 SURVIE
- ## 45 1 DECES
- ## 46 2 SURVIE
- ## 47 1 DECES
- ## 48 **DECES** 1
- ## 49 2 SURVIE
- ## 50 1 **DECES**
- 2 SURVIE ## 51
- ## 52 2 SURVIE
- ## 53 1 DECES
- ## 54 **DECES** 1
- 2 SURVIE ## 55
- ## 56 1 DECES
- ## 57 2 SURVIE
- 2 SURVIE ## 58
- 2 SURVIE ## 59
- ## 60 2 SURVIE
- ## 61 1 DECES ## 62 2 SURVIE
- ## 63 1 DECES
- ## 64 2 SURVIE
- 2 SURVIE ## 65
- ## 66 2 SURVIE
- ## 67 1 DECES
- **DECES** ## 68 1
- ## 69 2 SURVIE
- ## 70 1 DECES
- 2 SURVIE ## 71 ## 72 1 DECES
- ## 73 1 DECES

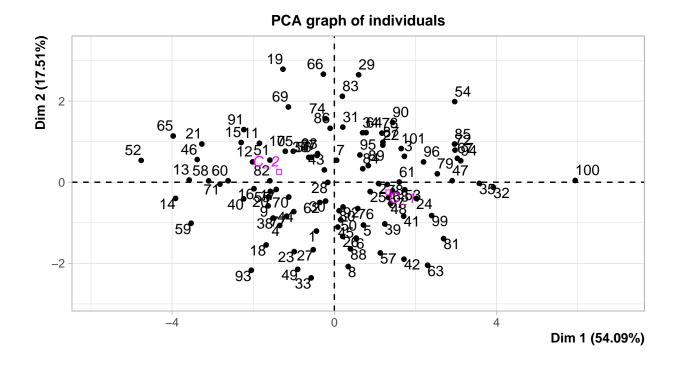
```
## 74 2 SURVIE
## 75 2 SURVIE
## 76 1 DECES
## 77 2 SURVIE
## 78
     1 DECES
## 79 1 DECES
## 80 2 SURVIE
## 81 1 DECES
## 82 2 SURVIE
## 83 2 SURVIE
## 84
     1 DECES
## 85
     1 DECES
## 86
     2 SURVIE
## 87
     1 DECES
## 88
     1 DECES
      1 DECES
## 89
## 90
     1 DECES
## 91
     2 SURVIE
## 92 1 DECES
## 93 1 DECES
## 94
     1 DECES
## 95
     1 DECES
## 96 1 DECES
      1 DECES
## 97
## 98 1 DECES
## 99 1 DECES
## 100 1 DECES
## 101 1 DECES
res_all <- PCA(
Х,
 quali.sup = quali_indice
)
```



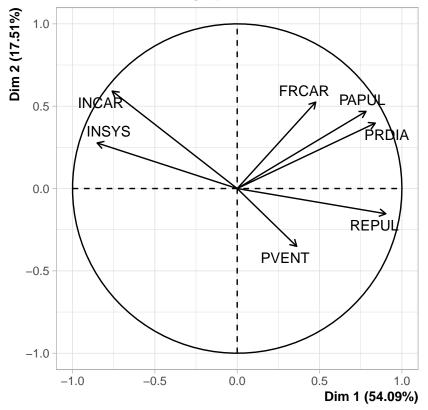




```
res_all_2 <- PCA(
    X[,-c(2)],
    quali.sup = 1
)</pre>
```



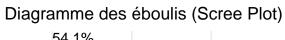
## PCA graph of variables

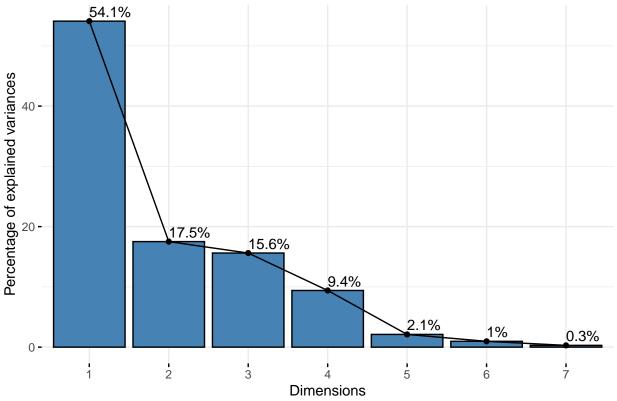


#### summary(res)

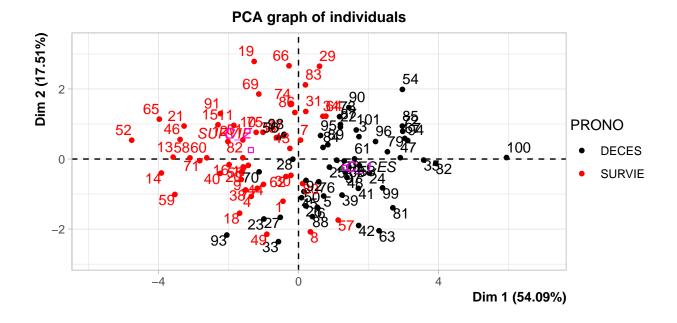
```
##
## Call:
## PCA(X = Xquanti)
##
##
## Eigenvalues
##
                           Dim.1
                                   Dim.2
                                            Dim.3
                                                                              Dim.7
                                                    Dim.4
                                                             Dim.5
                                                                     Dim.6
## Variance
                           3.787
                                   1.226
                                            1.093
                                                    0.658
                                                             0.148
                                                                     0.068
                                                                              0.021
## % of var.
                          54.094
                                                                     0.966
                                  17.514
                                           15.615
                                                    9.403
                                                             2.112
                                                                              0.296
  Cumulative % of var.
                          54.094
                                  71.607
                                                            98.738
                                                                    99.704 100.000
                                           87.223
                                                   96.626
##
##
  Individuals (the 10 first)
##
             Dist
                      Dim.1
                                              Dim.2
                                                                      Dim.3
                               ctr
                                      cos2
                                                        ctr
                                                              cos2
                                                                                ctr
            1.948 | -0.442 0.051
## 1
                                    0.052 | -1.205
                                                     1.172
                                                             0.382 |
                                                                      0.484
                                                                              0.212
## 2
            1.553 |
                      1.090
                             0.311
                                     0.493 | -0.032
                                                     0.001
                                                             0.000 |
                                                                              0.956
                                                                      1.027
##
  3
            2.314 |
                      1.726
                             0.779
                                    0.556 |
                                             0.638
                                                     0.329
                                                             0.076 | -1.268
                                                                              1.456
##
            1.774 | -1.348
                             0.475
                                    0.577 \mid -1.067
                                                     0.919
                                                             0.362 | -0.213
                                                                              0.041
## 5
            2.293 |
                      0.717
                             0.135
                                    0.098 | -1.055
                                                     0.899
                                                             0.212 |
                                                                      1.737
                                                                              2.732
##
  6
            1.650
                      0.539
                             0.076
                                    0.107 | -1.378
                                                      1.532
                                                             0.697 | -0.396
                                                                              0.142
## 7
                      0.057
                             0.001
                                    0.005 |
                                              0.540
                                                     0.236
                                                             0.422 |
            0.831 |
                                                                      0.336
                                                                              0.102
## 8
            2.332 |
                      0.340
                             0.030
                                    0.021 | -2.078
                                                     3.489
                                                             0.794 |
                                                                      0.578
                                                                              0.302
## 9
         1.874 | -1.632
                             0.697
                                    0.759 | -0.583
                                                     0.274
                                                             0.097 |
                                                                      0.673
                                                                              0.410
## 10
            1.822 | -1.210 0.383 0.441 | 0.762 0.469
                                                            0.175 | -1.113
```

```
##
          cos2
         0.062 I
## 1
## 2
         0.438 |
## 3
         0.300 |
## 4
         0.014 |
## 5
         0.574 |
## 6
         0.058 I
## 7
         0.163 |
## 8
         0.061 I
## 9
         0.129 |
## 10
         0.373 |
##
## Variables
##
                                  Dim.2
                                                                        cos2
           Dim.1
                    ctr
                          cos2
                                           ctr
                                                 cos2
                                                         Dim.3
                                                                  ctr
## FRCAR | 0.477 6.001 0.227 |
                                  0.525 22.475
                                                0.276 | -0.500 22.897 0.250 |
## INCAR | -0.759 15.217
                         0.576 |
                                  0.592 28.542
                                                0.350 |
                                                         0.219 4.369 0.048 |
## INSYS | -0.851 19.117 0.724 | 0.277 6.246
                                                0.077 |
                                                         0.394 14.197 0.155 |
## PRDIA | 0.838 18.558 0.703 | 0.397 12.866
                                                         0.284 7.377 0.081 |
                                                0.158
## PAPUL | 0.782 16.148 0.611 | 0.469 17.904
                                                0.219 |
                                                         0.320 9.377 0.102 |
## PVENT | 0.361 3.446 0.130 | -0.351 10.054 0.123 |
                                                         0.676 41.778 0.457 |
## REPUL | 0.903 21.513 0.815 | -0.153 1.913 0.023 |
                                                         0.008 0.006 0.000 |
library(factoextra)
## Le chargement a nécessité le package : ggplot2
## Welcome! Want to learn more? See two factoextra-related books at https://goo.gl/ve3WBa
fviz_eig(res, addlabels = TRUE, barfill = "steelblue", barcolor = "black") +
 ggtitle("Diagramme des éboulis (Scree Plot)")
```





plot(res\_all, habillage=2)



# 3. Interprétation (10 lignes minimum). Quelles sont les variables liées au pronostic ?

La dimension 1 et 2 represente 71.6% de variance expliqué à eux deux.

Les variables qui joue un role important sur le dignostiques sont les varibale les mieux progetés sur le plan. Voici la liste des variables liées au pronostic :

- INCAR
- INSYS
- PAPUL
- PRDIA
- RPUL

Le nuage de point semble assez dispersé sur l'axe vertical. Et etalé sur l'axe horizontal avec une perte de densité sur les extrémité.

Les observations comprenant un décés et C=1 ont tendance a etre positif dans la premieres dimension tandis que ce qui comprenent une survie et C=2 sont négatif sur la première dimension. La deuxieme dimension parrait uniform donc sans conclusion.

En conclusion, les décés semble etre lié à un score positif sur les variable qui contribuent positivement à la premiere dimension (e.i. PAPUL, PRDIA, RPUL). Les varibles contribuant le plus negativement à la

premiere dimension sont plutot lié à la survie (i.e. INCAR, INSYS). Les personnes avec l'attribue  $C\_1$  ont plus de risque de décéder tandis que les personne avec l'attribut  $C\_2$  ont plus de probabilité de survie.