## TP3

## Slim Kammoun

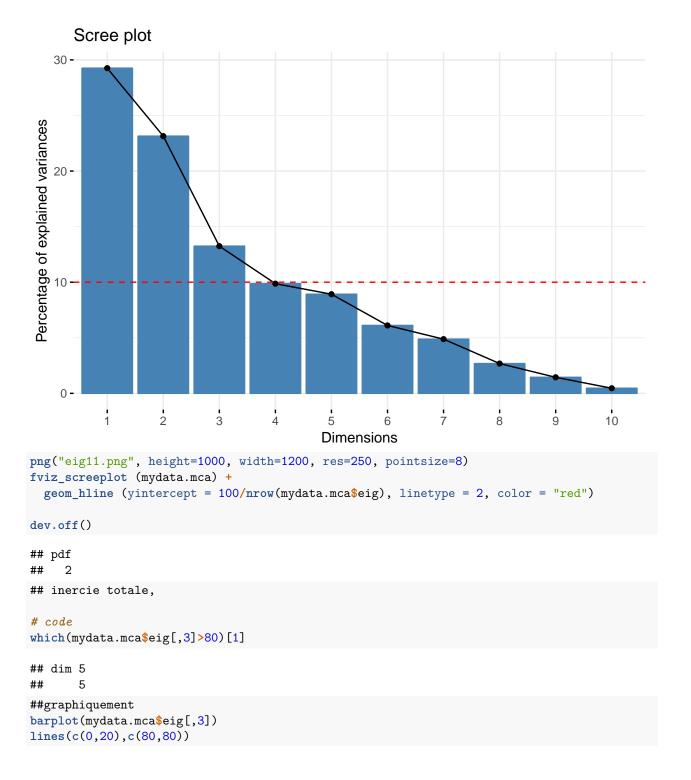
```
mydata=read.table("Race-canine.txt",sep="\t", head=T,encoding = "latin1", colClasses = "factor")
## encoding pour lire les accents
rownames (mydata) <-mydata$Race</pre>
mydata<-mydata[,-1]</pre>
head(mydata)
        Taille Poids Vélocité Intelligence Affection Agressivité Fonction
## BEAU
                    2
                             3
                                           3
                                                      2
                                                                  2
                                                                            3
                                                                  2
                                                                            2
## BASS
             1
                    1
                             1
                                           1
                                                      1
## B.AL
             3
                    2
                             3
                                           3
                                                      2
                                                                  2
                                                                            3
## BOXE
             2
                    2
                             2
                                           2
                                                      2
                                                                  2
                                                                            1
## BULD
                                           2
                                                      2
             1
                    1
                                                                  1
                                                                            1
## BULM
                             1
                                           3
                                                      1
                                                                            3
library(FactoMineR)
library(factoextra)
## Loading required package: ggplot2
## Welcome! Related Books: `Practical Guide To Cluster Analysis in R` at https://goo.gl/13EFCZ
library(ggplot2)
library(plyr)
mydata.mca = MCA(mydata, graph=FALSE,quali.sup = 7,ncp=4)
RQ: Le nombre de valeurs propres maxiamale dans ]0,1[ est la somme sur les variables (nb modalité -1) ici
(3-1)+(3-1)+(3-1)+(3-1)+(2-1)+(2-1)=10
library(xlsx)
mydata.mca$eig
           eigenvalue percentage of variance
## dim 1 0.487590671
                                    29.2554403
## dim 2 0.385667752
                                    23.1400651
## dim 3 0.220728360
                                    13.2437016
## dim 4 0.164472270
                                     9.8683362
## dim 5 0.148659735
                                     8.9195841
## dim 6 0.101816275
                                     6.1089765
## dim 7 0.081305114
                                     4.8783069
## dim 8 0.044665793
                                     2.6799476
## dim 9 0.024078978
                                     1.4447387
## dim 10 0.007681718
                                     0.4609031
##
          cumulative percentage of variance
## dim 1
                                     29.25544
## dim 2
                                     52.39551
## dim 3
                                     65.63921
## dim 4
                                     75.50754
## dim 5
                                     84.42713
## dim 6
                                     90.53610
## dim 7
                                     95.41441
```

```
## dim 8
                                      98.09436
## dim 9
                                      99.53910
## dim 10
                                     100.00000
fviz_eig(mydata.mca, addlabels = TRUE)
      Scree plot
            29.3%
   30 -
Percentage of explained variances
                     23.1%
                              13.2%
                                      9.9%
                                               8.9%
                                                        6.1%
                                                                 4.9%
                                                                          2.7%
                                                                                   1.4%
                                                                                           0.5%
    0 -
                                      4
                                                       6
                                                                         8
                                                                                          10
                                              5
                                                                                  9
                                             Dimensions
eig=mydata.mca$eig
write.xlsx(as.data.frame(eig),file="TP3.xlsx",sheetName="eig")
## inercie moyenne (Critère de Kaiser)
# code
## les commandes sont équivalents
sum(mydata.mca$eig[,2]>(100/nrow(mydata.mca$eig)), na.rm=TRUE)
```

```
# code
## les commandes sont équivalents
sum(mydata.mca$eig[,2]>(100/nrow(mydata.mca$eig)), na.rm=TRUE)

## [1] 3
sum(mydata.mca$eig[,1]>(sum(mydata.mca$eig[,1])/nrow(mydata.mca$eig)), na.rm=TRUE)

## [1] 3
### graphiquement
fviz_screeplot (mydata.mca) +
    geom_hline (yintercept = 100/nrow(mydata.mca$eig), linetype = 2, color = "red")
```



```
100
80
9
4
20
0
        dim 1
                     dim 3
                                                               dim 9
                                   dim 5
                                                 dim 7
png("eig12.png", height=1000, width=1200, res=250, pointsize=8)
barplot(mydata.mca$eig[,3])
lines(c(0,20),c(80,80))
dev.off()
## pdf
##
     2
##Q2##
mydata.mca$var$contrib
##
                      Dim 1
                                   Dim 2
                                               Dim 3
                                                           Dim 4
## Taille_1
                  12.553839 8.704555e+00 8.68815258
                                                      0.01578023
## Taille 2
                   4.535510 1.224454e+01 13.46697104
                                                      3.82791292
## Taille_3
                  13.322448 2.307632e-05
                                                      1.47720499
                                          0.01105694
## Poids_1
                  14.010709 7.906445e+00
                                          4.23412382
                                                      0.86334566
## Poids_2
                   1.922595 1.479251e+01
                                         1.35478624
                                                      1.28604643
## Poids_3
                   5.829749 8.288840e+00 20.70679054
                                                      0.52172002
## Vélocité_1
                   1.582963 1.736933e+01 3.60747890
                                                      0.01978518
## Vélocité_2
                   3.637845 1.024184e+01
                                          3.47591976
                                                      1.18138110
## Vélocité_3
                   9.762175 1.892912e+00 14.13634026 1.37597681
## Intelligence_1 1.101761 8.530147e+00 2.07170863
                                                      0.38972813
## Intelligence_2
                   3.299734 1.119923e+00 13.20977953
                                                      9.05229126
## Intelligence_3 1.578185 3.016142e+00 10.36832982 21.22170349
## Affection_1
                  10.750805 2.095476e+00
                                         1.06659687
                                                      2.72454975
## Affection_2
                   9.982890 1.945799e+00 0.99041137
                                                      2.52993905
## Agressivité_1
                   2.950901 8.914721e-01
                                          1.25741474 25.76534276
## Agressivité_2
                   3.177893 9.600469e-01 1.35413895 27.74729221
mydata.mca$var$cos2
##
                                    Dim 2
                       Dim 1
                                                 Dim 3
                                                               Dim 4
                  0.49581192 2.719224e-01 0.1553354552 0.0002102282
## Taille_1
## Taille_2
                  0.16284478 3.477347e-01 0.2188872152 0.0463603889
## Taille_3
                  0.87694667 1.201472e-06 0.0003294784 0.0327995000
```

```
## Poids 1
                 0.58247448 2.599896e-01 0.0796861975 0.0121070633
## Poids 2
                 0.11681934 7.109302e-01 0.0372649528 0.0263585186
## Poids 3
                 0.20931365 2.353962e-01 0.3365605898 0.0063186241
## Vélocité_1
                 0.07355161 6.383552e-01 0.0758801234 0.0003100978
## Vélocité 2
                 0.15123804 3.367850e-01 0.0654167993 0.0165670095
                 0.42839511 6.570317e-02 0.2808262078 0.0203679027
## Vélocité 3
## Intelligence 1 0.04580407 2.804990e-01 0.0389895501 0.0054653233
## Intelligence 2 0.17376329 4.664716e-02 0.3149034805 0.1607958967
## Intelligence 3 0.06233016 9.422151e-02 0.1853753391 0.2827209221
## Affection_1
                 0.60657339 9.351538e-02 0.0272424033 0.0518530622
## Affection_2
                 0.60657339 9.351538e-02 0.0272424033 0.0518530622
## Agressivité_1 0.17930056 4.284427e-02 0.0345866377 0.5280806741
## Agressivité_2 0.17930056 4.284427e-02 0.0345866377 0.5280806741
mydata.mca$var$coord
##
                      Dim 1
                                   Dim 2
                                               Dim 3
                                                          Dim 4
## Taille_1
                  1.1902124 0.8814312493 -0.66619486
                                                     0.0245082
                  0.8464733 -1.2369449391 0.98137849
## Taille 2
                                                     0.4516478
## Taille_3
                 ## Poids_1
                 1.1761704 0.7857960033 -0.43503416 0.1695709
                 -0.3293556 -0.8124958119 -0.18601927 -0.1564473
## Poids 2
## Poids 3
                 -0.9596770 1.0177146680 1.21690862 0.1667392
## Vélocité_1
                0.3536067 1.0417311970 0.35916042 0.0229601
## Vélocité_2
                 0.5993249 -0.8943513681 0.39416354 0.1983599
## Vélocité_3
                 -0.9256296 -0.3625001139 -0.74943473 -0.2018311
## Intelligence_1 -0.3298252  0.8162016046 -0.30430278 -0.1139304
## Intelligence 2 0.4660516 -0.2414724706 0.62739888 -0.4483245
## Intelligence_3 -0.4220026 -0.5188490270 -0.72776633 0.8987625
## Affection_1
                 ## Affection_2
                 0.7504976 -0.2946789888 -0.15904879 0.2194294
## Agressivité_1
                0.4080360 -0.1994591783 -0.17920983 -0.7002575
## Agressivité_2 -0.4394234 0.2148021920 0.19299520 0.7541235
mydata.mca$var$v.test
##
                     Dim 1
                                 Dim 2
                                             Dim 3
                                                        Dim 4
                 3.590419 2.658943687 -2.00965714 0.07393195
## Taille_1
## Taille_2
                 2.057660 -3.006842664 2.38559586 1.09789349
## Taille 3
                 -4.774999 0.005589121 -0.09255506 -0.92346467
## Poids 1
                 3.891572 2.599948123 -1.43938915 0.56105583
## Poids 2
                 -1.742786 -4.299323719 -0.98432148 -0.82784146
## Poids 3
                 -2.332843 2.473924090 2.95813714 0.40531991
## Vélocité 1
                 1.382874 4.073970535 1.40459361
                                                   0.08979167
## Vélocité 2
                 1.982975 -2.959123171 1.30416133 0.65630957
## Vélocité 3
                 -3.337405 -1.307012748 -2.70212535 -0.72771249
## Intelligence_1 -1.091286 2.700550551 -1.00684075 -0.37695942
## Intelligence_2 2.125522 -1.101283907 2.86137912 -2.04467438
## Intelligence_3 -1.273022 -1.565170677 -2.19539491 2.71122555
                -3.971260 1.559294642 0.84160708 -1.16111137
## Affection_1
                  3.971260 -1.559294642 -0.84160708 1.16111137
## Affection_2
## Agressivité_1
                  2.159124 -1.055438765 -0.94828929 -3.70541462
## Agressivité_2 -2.159124 1.055438765 0.94828929 3.70541462
write.xlsx(mydata.mca$var$contrib,file="TP3.xlsx",sheetName="var_contrib",append=T)
write.xlsx(mydata.mca$var$cos2,file="TP3.xlsx",sheetName="var_cos2",append=T)
```

```
write.xlsx(mydata.mca$var$coord,file="TP3.xlsx",sheetName="var_coord",append=T)
write.xlsx(mydata.mca$var$v.test,file="TP3.xlsx",sheetName="var_vtest",append=T)
sign(mydata.mca$var$coord)
##
                 Dim 1 Dim 2 Dim 3 Dim 4
## Taille 1
                     1
                          1
                               -1
## Taille_2
                    1
                         -1
                                1
## Taille 3
                   -1
                          1
                               -1
                                     -1
## Poids 1
                    1
                          1
                               -1
                                      1
## Poids 2
                   -1
                         -1
                               -1
                                     -1
## Poids 3
                   -1
                         1
## Vélocité_1
                   1
                               1
                                      1
## Vélocité_2
                    1
                         -1
                                1
                                      1
                    -1
                         -1
                               -1
## Vélocité_3
                                     -1
## Intelligence_1
                   -1
## Intelligence_2
                    1
                         -1
                                     -1
                                1
## Intelligence_3
                    -1
                         -1
                               -1
                                      1
## Affection_1
                    -1
                               1
                         1
                                     -1
## Affection_2
                   1
                         -1
                               -1
                                     1
## Agressivité_1
                   1
                          -1
                               -1
                                     -1
## Agressivité_2
#Q 3
Taille=colSums(mydata.mca$var$contrib[1:3,])
Poid=colSums(mydata.mca$var$contrib[4:6,])
Velocité=colSums(mydata.mca$var$contrib[7:9,])
Intellegence=colSums(mydata.mca$var$contrib[10:12,])
Affection=colSums(mydata.mca$var$contrib[12:14,])
Agressivité=colSums(mydata.mca$var$contrib[14:16,])
tab=rbind(Taille, Poid, Velocité, Intellegence, Affection, Agressivité)
tab
##
                   Dim 1
                            Dim 2
                                      Dim 3
                                                Dim 4
## Taille
               30.411797 20.949116 22.166181 5.320898
## Poid
               21.763052 30.987798 26.295701 2.671112
## Velocité 14.982983 29.504080 21.219739 2.577143
## Intellegence 5.979679 12.666212 25.649818 30.663723
               22.311880 7.057417 12.425338 26.476192
## Affection
## Agressivité 16.111684 3.797318 3.601965 56.042574
write.xlsx(tab,file="TP3.xlsx",sheetName="var",append=T)
# 4
mydata.mca$ind$contrib
            Dim 1
                       Dim 2
                                   Dim 3
                                               Dim 4
## BEAU 2.10111844 2.17369113 5.71765657 6.95239166
## BASS 0.56486551 11.38631564 0.98243645 1.46630641
## B.AL 2.10111844 2.17369113 5.71765657 6.95239166
## BOXE 1.55161864 7.37413469 7.23383138 3.94745005
## BULD 8.16803372 2.69348375 0.43318803 1.92862044
## BULM 4.19439182 2.97447169 3.02225475 7.93336291
## CANI 5.93132626 0.03987790 6.63864170 2.49757571
## CHIH 5.44955505 6.35455623 4.04841413 0.54260890
## COCK 4.30303195 0.05013761 5.18408763 5.20091611
```

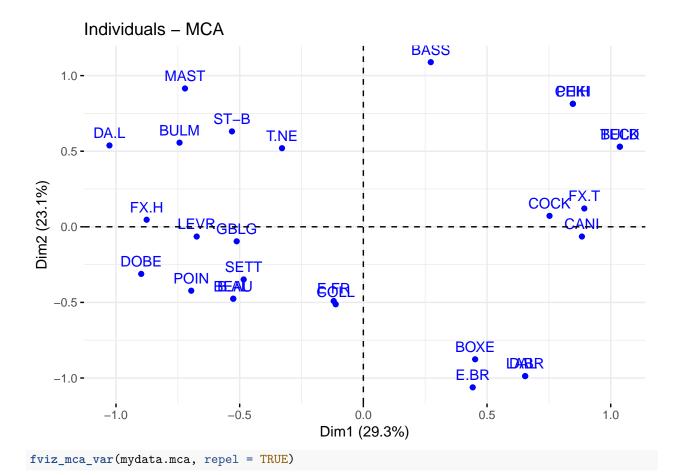
```
## COLL 0.09477557
                   2.52234098 0.92694388
                                            7.98979010
                   9.36400725
## DAL 3.25124622
                                4.61695759
                                            0.72162030
## DOBE 6.12510519
                                3.65246368
                    0.93187754
                                            3.05539455
## DA.L 8.00267820
                    2.77932193
                                0.55185326
                                            0.16265782
## E.BR 1.48580379 10.82905948
                                0.03220594
                                            3.15977886
## E.FR 0.10894759
                   2.31498957
                                1.39016885
                                            8.61392102
## FX.H 5.82864293
                   0.02102208
                                1.67906747
                                            0.05151197
## FX.T 6.06211255
                    0.14101775
                                0.00441401
                                            3.20271975
## GBLG 1.99121023
                    0.08840951
                                0.13397424
                                            0.30634135
## LABR 3.25124622
                   9.36400725
                                4.61695759
                                            0.72162030
## LEVR 3.44762033
                   0.03981654
                                3.37330515
                                            9.38358594
## MAST 3.94969799
                   8.03718894
                                5.54045425
                                            0.70844447
## PEKI 5.44955505
                   6.35455623
                                4.04841413
                                            0.54260890
## POIN 3.67647489
                   1.71575624
                                6.01235105
                                            1.18446820
## ST-B 2.14281499
                    3.82340445 13.74714214
                                            0.03593434
## SETT 1.77749654
                    1.16463313
                                0.23305630 13.80413634
## TECK 8.16803372
                   2.69348375 0.43318803
                                            1.92862044
## T.NE 0.82147815
                   2.59474760 10.02891524
                                            7.00522151
mydata.mca$ind$cos2
             Dim 1
                         Dim 2
                                      Dim 3
                                                   Dim 4
## BEAU 0.19318200 0.158078170 0.2379780727 0.2156193132
## BASS 0.03893080 0.620711031 0.0306517673 0.0340886922
## B.AL 0.19318200 0.158078170 0.2379780727 0.2156193132
## BOXE 0.11183606 0.420403058 0.2360304269 0.0959733835
## BULD 0.64266568 0.167625423 0.0154293198 0.0511860542
## BULM 0.27815801 0.156023623 0.0907311457 0.1774668333
## CANI 0.38024293 0.002022086 0.1926598936 0.0540088961
## CHIH 0.38556757 0.355617092 0.1296663063 0.0129498182
## COCK 0.28975347 0.002670396 0.1580262244 0.1181329992
## COLL 0.01095173 0.230541033 0.0484889401 0.3114290851
## DAL 0.23755593 0.541172466 0.1527125209 0.0177853352
## DOBE 0.55359781 0.066618921 0.1494408973 0.0931505474
## DA.L 0.53895247 0.148051191 0.0168244731 0.0036951098
## E.BR 0.09451162 0.544844311 0.0009273902 0.0677981326
## E.FR 0.01169406 0.196541690 0.0675488576 0.3118788278
## FX.H 0.55756256 0.001590595 0.0727104867 0.0016621553
## FX.T 0.44081779 0.008110859 0.0001453019 0.0785581701
## GBLG 0.18220281 0.006398746 0.0055496040 0.0094554212
## LABR 0.23755593 0.541172466 0.1527125209 0.0177853352
## LEVR 0.33582962 0.003067758 0.1487503335 0.3083228462
## MAST 0.27298068 0.439369729 0.1733469229 0.0165162378
## PEKI 0.38556757 0.355617092 0.1296663063 0.0129498182
## POIN 0.33802415 0.124775596 0.2502437311 0.0367347283
## ST-B 0.16426904 0.231835114 0.4770745045 0.0009292189
## SETT 0.20103461 0.104185949 0.0119323415 0.5266336570
## TECK 0.64266568 0.167625423 0.0154293198 0.0511860542
## T.NE 0.06389477 0.159632893 0.3531230245 0.1837928020
mydata.mca$ind$coord
             Dim 1
                         Dim 2
                                     Dim 3
                                                 Dim 4
## BEAU -0.5259384 -0.47575949 -0.58374071
                                            0.55564235
## BASS 0.2726981 1.08888034 -0.24197092
                                            0.25517645
```

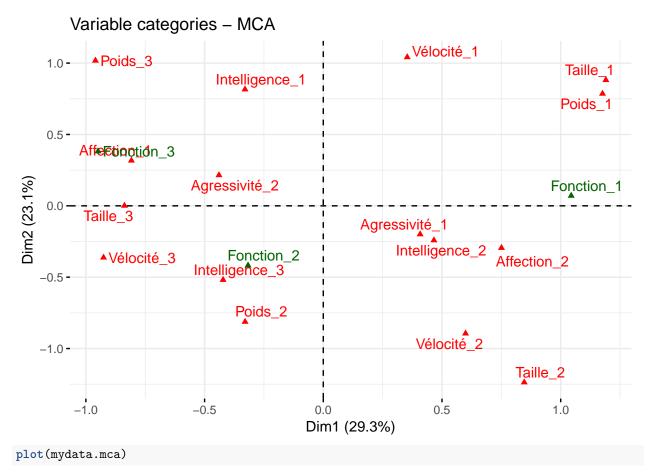
```
## B.AL -0.5259384 -0.47575949 -0.58374071 0.55564235
## BOXE 0.4519622 -0.87628238 0.65659133 0.41868418
## BULD 1.0369751 0.52959725 -0.16067532 -0.29265208
## BULM -0.7430945  0.55653626  0.42440108  0.59354942
## CANI
        0.8836606 -0.06443988 -0.62899988 0.33303322
## CHIH 0.8470130 0.81345055 -0.49119441 -0.15522858
## COCK 0.7526566 0.07225541 0.55583657 0.48058272
## COLL -0.1117012 -0.51249596 -0.23503778 -0.59565654
## DAL
        0.6542361 -0.98745978 0.52455242 -0.17901219
## DOBE -0.8979794 -0.31150711 -0.46655613 0.36835102
## DA.L -1.0264251 0.53796989 0.18135217
                                          0.08498958
## E.BR 0.4422729 -1.06190072 0.04381058
                                          0.37459034
## E.FR -0.1197618 -0.49097917
                              0.28783575 -0.61848428
## FX.H -0.8759782 0.04678712 -0.31633338 -0.04782801
## FX.T 0.8933499 0.12117846 -0.01621913 0.37712706
## GBLG -0.5119978 -0.09594847 0.08935556 0.11663557
## LABR 0.6542361 -0.98745978 0.52455242 -0.17901219
## LEVR -0.6737043 -0.06439028 -0.44837229 -0.64552437
## MAST -0.7210934 0.91483050 0.57462384 0.17737039
## PEKI 0.8470130 0.81345055 -0.49119441 -0.15522858
## POIN -0.6957054 -0.42268452 -0.59859504 -0.22934534
## ST-B -0.5311313  0.63097720  0.90514293  0.03994690
## SETT -0.4837422 -0.34824358 -0.11785320 -0.78294787
## TECK 1.0369751 0.52959725 -0.16067532 -0.29265208
## T.NE -0.3288574 0.51979980 0.77310402 -0.55774946
```

## sign(mydata.mca\$ind\$coord)

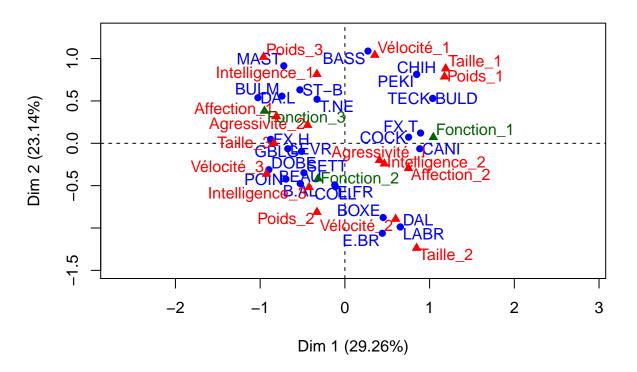
```
##
         Dim 1 Dim 2 Dim 3 Dim 4
## BEAU
             -1
                    -1
                           -1
## BASS
              1
                     1
                           -1
                                   1
## B.AL
             -1
                    -1
## BOXE
              1
                    -1
                                   1
                            1
## BULD
             1
                                  -1
                     1
                           -1
## BULM
            -1
                     1
                            1
                                   1
## CANI
             1
                    -1
                           -1
                                   1
## CHIH
                          -1
              1
                     1
                                  -1
## COCK
             1
                     1
                            1
                                   1
## COLL
             -1
                    -1
                           -1
                                  -1
## DAL
             1
                    -1
                                  -1
                            1
## DOBE
             -1
                    -1
                           -1
                                   1
## DA.L
             -1
                     1
                                   1
                            1
## E.BR
             1
                    -1
                            1
                                   1
## E.FR
             -1
                    -1
                                  -1
                            1
## FX.H
             -1
                     1
                           -1
                                  -1
## FX.T
             1
                     1
                           -1
                                   1
## GBLG
             -1
                    -1
                            1
## LABR
             1
                    -1
                                  -1
                            1
## LEVR
             -1
                    -1
                           -1
                                  -1
## MAST
            -1
                     1
                            1
                                   1
## PEKI
             1
                     1
                                  -1
                           -1
                          -1
                                 -1
            -1
## POIN
                    -1
## ST-B
             -1
                     1
                           1
                                  1
            -1
                          -1
## SETT
                    -1
                                 -1
## TECK
              1
                     1
                           -1
                                  -1
```

```
## T.NE
          -1 1 1
write.xlsx(mydata.mca$ind,file="TP3.xlsx",sheetName="ind",append=T)
###5
mydata.mca$quali.sup
## $coord
##
                  Dim 1
                              Dim 2
                                          Dim 3
## Fonction_1 1.0443049 0.07066607 -0.09514675 -0.01504194
## Fonction_2 -0.3169202 -0.41793846 -0.18389428 -0.48130299
## Fonction_3 -0.9488459 0.38184818 0.32581450 0.56026829
##
## $cos2
                              Dim 2
##
                   Dim 1
                                          Dim 3
                                                       Dim 4
## Fonction_1 0.64151341 0.002937466 0.005325237 0.0001330941
## Fonction_2 0.05021921 0.087336276 0.016908553 0.1158262858
## Fonction_3 0.37907730 0.061392855 0.044696878 0.1321686561
##
## $v.test
                  Dim 1
                            Dim 2
                                       Dim 3
##
                                                   Dim 4
## Fonction_1 4.084036 0.2763587 -0.3720970 -0.05882555
## Fonction_2 -1.142672 -1.5068985 -0.6630403 -1.73536262
## Fonction_3 -3.139428 1.2634137 1.0780162 1.85374892
##
## $eta2
##
                         Dim 2
                                    Dim 3
                                              Dim 4
                Dim 1
## Fonction 0.7041534 0.1032761 0.04607865 0.1703089
write.xlsx(mydata.mca$quali.sup,file="TP3.xlsx",sheetName="quali.sup",append=T)
##6
fviz_mca_ind(mydata.mca,)
```





## **MCA** factor map



```
png("plot1.png", height=800, width=800, res=250, pointsize=8)

fviz_mca_ind(mydata.mca,)
dev.off()

## pdf
## 2
png("plot2.png", height=800, width=800, res=250, pointsize=8)

fviz_mca_var(mydata.mca, repel = TRUE)
dev.off()

## pdf
## 2
png("plot3.png", height=800, width=800, res=250, pointsize=8)

plot(mydata.mca)
dev.off()

## pdf
## 2
```