## Devoir 6

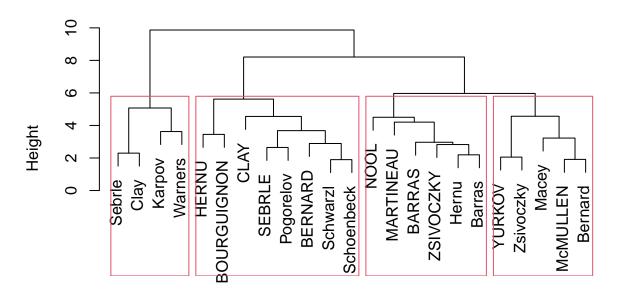
## EL Hadrami

30/12/2020

```
library("FactoMineR")
library("factoextra")
## Loading required package: ggplot2
## Welcome! Want to learn more? See two factoextra-related books at https://goo.gl/ve3WBa
library("corrplot")
## corrplot 0.84 loaded
library("fpc")
Application de CAH et K-means sur les données Dechathlon
# chargement des données decathlon2
data("decathlon2")
decathlon2.active <- decathlon2[1:23,1:10]
head(decathlon2.active,4)
           X100m Long.jump Shot.put High.jump X400m X110m.hurdle Discus Pole.vault
##
           11.04
                               14.83
                                          2.07 49.81
## SEBRLE
                      7.58
                                                             14.69 43.75
                      7.40
           10.76
                               14.26
                                                             14.05 50.72
                                                                                4.92
## CLAY
                                          1.86 49.37
## BERNARD 11.02
                      7.23
                               14.25
                                          1.92 48.93
                                                             14.99 40.87
                                                                                5.32
## YURKOV
           11.34
                      7.09
                               15.19
                                          2.10 50.42
                                                             15.31 46.26
                                                                                4.72
##
           Javeline X1500m
## SEBRLE
              63.19 291.7
## CLAY
              60.15
                     301.5
## BERNARD
              62.77
                     280.1
## YURKOV
              63.44
                     276.4
summary(decathlon2.active)
##
        X100m
                      Long.jump
                                        Shot.put
                                                       High.jump
                           :6.800
##
   Min.
           :10.44
                                            :12.68
                                                            :1.860
                    Min.
                                     Min.
                                                     Min.
##
    1st Qu.:10.84
                    1st Qu.:7.165
                                     1st Qu.:14.17
                                                     1st Qu.:1.940
##
    Median :10.97
                    Median :7.310
                                     Median :14.65
                                                     Median :2.010
##
    Mean
           :11.00
                    Mean
                           :7.350
                                     Mean
                                           :14.62
                                                     Mean
                                                            :2.007
##
    3rd Qu.:11.23
                    3rd Qu.:7.525
                                     3rd Qu.:15.14
                                                     3rd Qu.:2.095
    Max.
           :11.64
                    Max.
                            :7.960
                                     Max.
                                            :16.36
                                                     Max.
                                                             :2.150
##
##
        X400m
                     X110m.hurdle
                                         Discus
                                                       Pole.vault
   Min.
           :46.81
                    Min.
                           :13.97
                                     Min.
                                            :37.92
                                                     Min.
                                                            :4.400
   1st Qu.:48.95
                    1st Qu.:14.17
                                     1st Qu.:43.74
                                                     1st Qu.:4.610
##
                                     Median :44.75
##
  Median :49.40
                    Median :14.37
                                                     Median :4.820
                                                             :4.797
## Mean
           :49.43
                    Mean
                           :14.53
                                     Mean
                                            :45.16
                                                     Mean
## 3rd Qu.:50.02
                    3rd Qu.:14.94
                                     3rd Qu.:46.93
                                                     3rd Qu.:5.000
```

```
##
            :51.16
                      Max.
                             :15.67
                                                :51.65
                                                                 :5.320
                                                         Max.
##
       Javeline
                          X1500m
##
    Min.
            :52.33
                      Min.
                              :262.1
    1st Qu.:55.40
                      1st Qu.:268.8
##
##
    Median :57.44
                      Median :278.1
            :59.11
                              :277.9
##
    Mean
                      Mean
    3rd Qu.:62.98
                      3rd Qu.:283.6
##
    Max.
            :70.52
                      Max.
                              :301.5
Realisation d'une CAH
decathlon2.active.cr <- scale(decathlon2.active,center=T,scale=T)</pre>
dist.dec2 <- dist(decathlon2.active.cr)</pre>
clust.dc2 <- hclust(dist.dec2,method = "ward.D2")</pre>
plot(clust.dc2)
rect.hclust(clust.dc2,k=4)
```

## **Cluster Dendrogram**



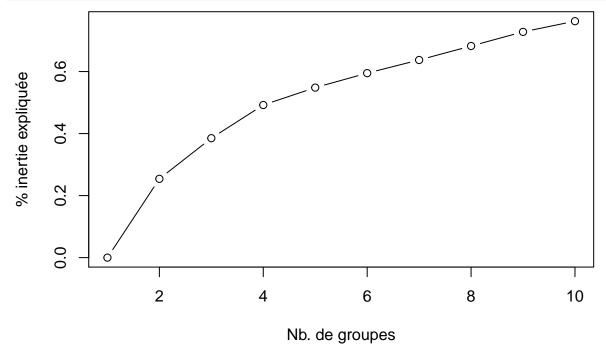
dist.dec2 hclust (\*, "ward.D2")

```
print(sort(cutree(clust.dc2,k=4)))
        SEBRLE
                        CLAY
                                                  HERNU BOURGUIGNON
##
                                  BERNARD
                                                                         Schwarzl
##
                                                      1
##
     Pogorelov
                 Schoenbeck
                                   YURKOV
                                              McMULLEN
                                                                        Zsivoczky
                                                               Macey
##
                                                      2
                                                                    2
                                                                                 2
##
                   ZSIVOCZKY
                                MARTINEAU
                                                 BARRAS
                                                                NOOL
       Bernard
                                                                            Hernu
##
                           3
                                                      3
                                                                    3
                                                                                 3
##
        Barras
                      Sebrle
                                     Clay
                                                 Karpov
                                                             Warners
##
```

Le dendogramme suggere un decoupage en 4 groupes, nous verrons ensuite la methode de K-means pour trouver le nombre de decoupages (k) optimal afin de confirmer ou rejetter le nombre de decoupages trouvés

sur la methode de classification. La methode de K-means

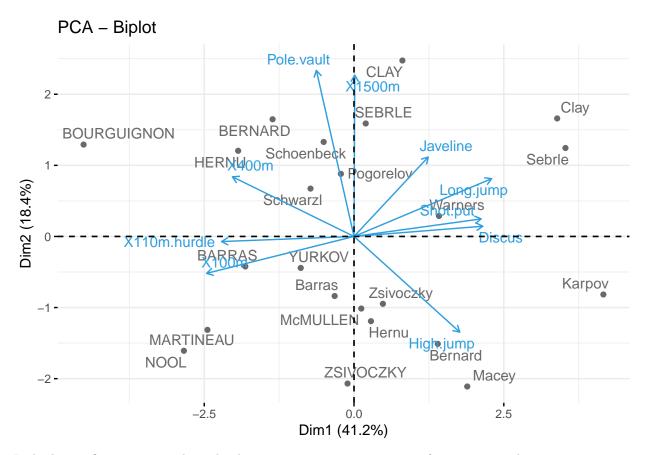
```
groupes.kmeans <- kmeans(decathlon2.active.cr,centers=4,nstart=5)
inertie <- rep(0,times=10)
for (k in 2:10){
   group <- kmeans(decathlon2.active.cr,centers = k,nstart=5)
   inertie[k] <- group$betweenss/group$totss
}
plot(1:10,inertie,type="b",xlab="Nb. de groupes",ylab="% inertie expliquée")</pre>
```



Le graphe ci - dessus montre l'evolution de la proportion d'inertie, on constate qu'a partir de k=4 classes, l'adjonction d'un groupe supplémentaire n'augmente pas «significativement» la part d'inertie expliquée par la partition.

Construction d'un diagramme d'individus et des variables

```
res.da <- PCA(decathlon2.active,scale.unit = TRUE,graph = FALSE)
fviz_pca_biplot(res.da,repel = TRUE,col.var = "#2E9FDF", col.ind = "#696969")</pre>
```



Le biplot confirme aussi que les individus peuvent etre regrouper pour former quatre classes.