Untitled

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R Markdown

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When you click the **Knit** button a document will be generated that includes both content as well as the output of any embedded R code chunks within the document. You can embed an R code chunk like this:

```
Cereals <- read.csv("C:\\Users\\13308\\OneDrive\\Documents\\64060_-spavliga\\Cereals.csv")</pre>
#1
data <- Cereals
data <- data[,-3]
data <- data[,-2]
data <- data[,-1]
sum(is.na(data))
## [1] 4
data <- na.omit(data)
sum(is.na(data))
## [1] 0
head(data)
##
     calories protein fat sodium fiber carbo sugars potass vitamins shelf weight
## 1
            70
                                130
                                     10.0
                                             5.0
                                                       6
                                                            280
                                                                       25
                                                                               3
                                                                                       1
                          1
           120
## 2
                      3
                          5
                                      2.0
                                             8.0
                                                       8
                                                                        0
                                                                               3
                                 15
                                                            135
                                                                                       1
                                                                               3
## 3
            70
                      4
                          1
                                260
                                      9.0
                                             7.0
                                                       5
                                                            320
                                                                       25
                                                                                       1
            50
                      4
                                     14.0
                                                                       25
                                                                               3
## 4
                          0
                                140
                                             8.0
                                                       0
                                                            330
                                                                                       1
## 6
           110
                      2
                          2
                                180
                                            10.5
                                                      10
                                                             70
                                                                       25
                                                                               1
                                      1.5
                                                                                       1
                                                                               2
## 7
           110
                                125
                                      1.0
                                            11.0
                                                      14
                                                             30
                                                                       25
                                                                                       1
##
     cups
             rating
## 1 0.33 68.40297
## 2 1.00 33.98368
## 3 0.33 59.42551
## 4 0.50 93.70491
## 6 0.75 29.50954
## 7 1.00 33.17409
```

datanorm <- scale(data) summary(datanorm)</pre>

```
##
      calories
                       protein
                                                           sodium
                                           fat
##
   Min. :-2.8738
                    Min. :-1.40687
                                      Min. :-0.9932
                                                       Min. :-1.9616
   1st Qu.:-0.3541
                    1st Qu.:-0.47733
##
                                      1st Qu.:-0.9932
                                                       1st Qu.:-0.3306
   Median : 0.1498
                    Median :-0.01256
                                      Median : 0.0000
                                                       Median : 0.2131
##
   Mean : 0.0000
                    Mean : 0.00000
                                      Mean : 0.0000
                                                       Mean : 0.0000
   3rd Qu.: 0.1498
                    3rd Qu.: 0.45221
                                      3rd Qu.: 0.0000
                                                       3rd Qu.: 0.6661
  Max. : 2.6695
                    Max. : 3.24083
                                      Max. : 3.9729
                                                       Max. : 1.9045
##
                         carbo
##
       fiber
                                           sugars
                                                            potass
##
  Min. :-0.89778
                     Min. :-2.50014
                                       Min. :-1.6306
                                                        Min. :-1.1783
   1st Qu.:-0.79462
                     1st Qu.:-0.70143
                                       1st Qu.:-0.9424
                                                        1st Qu.:-0.8079
  Median :-0.07249
                     Median : -0.05903
                                       Median :-0.0248
                                                        Median :-0.1201
##
                     Mean : 0.00000
## Mean : 0.00000
                                       Mean : 0.0000
                                                        Mean : 0.0000
   3rd Qu.: 0.34015
##
                     3rd Qu.: 0.58337
                                       3rd Qu.: 0.8928
                                                        3rd Qu.: 0.3031
## Max. : 4.87925
                     Max. : 2.12512
                                       Max. : 1.8104
                                                        Max. : 3.2660
##
      vitamins
                        shelf
                                         weight
                                                           cups
                                                      Min. :-2.4251
##
  Min. :-1.3032
                    Min. :-1.4617
                                     Min. :-3.4600
  1st Qu.:-0.1818
##
                    1st Qu.:-1.1612
                                     1st Qu.:-0.2008
                                                      1st Qu.:-0.6432
## Median :-0.1818
                    Median :-0.2599
                                     Median :-0.2008
                                                      Median :-0.3038
                                     Mean : 0.0000
##
   Mean : 0.0000
                    Mean : 0.0000
                                                      Mean : 0.0000
##
   3rd Qu.:-0.1818
                    3rd Qu.: 0.9420
                                     3rd Qu.:-0.2008
                                                      3rd Qu.: 0.7568
  Max. : 3.1822
                    Max. : 0.9420
                                     Max. : 3.0583
                                                      Max. : 2.8780
##
       rating
   Min. :-1.7336
##
##
  1st Qu.:-0.7071
  Median :-0.1510
## Mean : 0.0000
##
   3rd Qu.: 0.5807
## Max. : 3.6578
```

str(data)

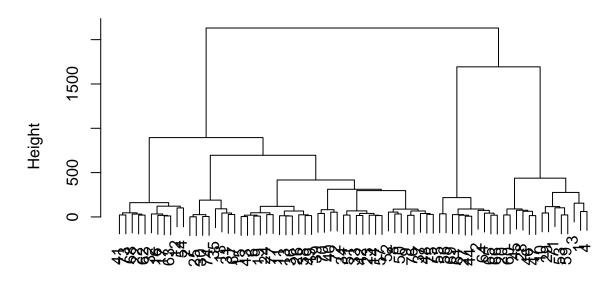
```
74 obs. of 13 variables:
## 'data.frame':
   $ calories: int 70 120 70 50 110 110 130 90 90 120 ...
   $ protein : int  4 3 4 4 2 2 3 2 3 1 ...
             : int 1510202102...
   $ fat
   $ sodium : int 130 15 260 140 180 125 210 200 210 220 ...
   $ fiber : num 10 2 9 14 1.5 1 2 4 5 0 ...
##
   $ carbo
             : num 5 8 7 8 10.5 11 18 15 13 12 ...
   $ sugars : int 6 8 5 0 10 14 8 6 5 12 ...
## $ potass : int 280 135 320 330 70 30 100 125 190 35 ...
## $ vitamins: int 25 0 25 25 25 25 25 25 25 ...
   $ shelf : int 3 3 3 3 1 2 3 1 3 2 ...
##
##
   $ weight : num 1 1 1 1 1 1 1 1.33 1 1 1 ...
## $ cups : num 0.33 1 0.33 0.5 0.75 1 0.75 0.67 0.67 0.75 ...
## $ rating : num 68.4 34 59.4 93.7 29.5 ...
   - attr(*, "na.action")= 'omit' Named int [1:3] 5 21 58
##
## ..- attr(*, "names")= chr [1:3] "5" "21" "58"
```

```
datatest <- dist(data, method = "euclidean")
dataclust <- hclust(datatest, method = "ward")

## The "ward" method has been renamed to "ward.D"; note new "ward.D2"

# plot(dataclust, cex = 0.6, hang = -1)
plot(dataclust)</pre>
```

Cluster Dendrogram



datatest hclust (*, "ward.D")

```
library(cluster)

datasingle <- agnes(data, method = "single")
datacomplete <- agnes(data, method= "complete")
dataaverage <- agnes(data, method = "average")
dataward <- agnes(data, method = "ward")

print(datasingle$ac)</pre>
```

[1] 0.7311616

```
print(datacomplete$ac)
```

[1] 0.922957

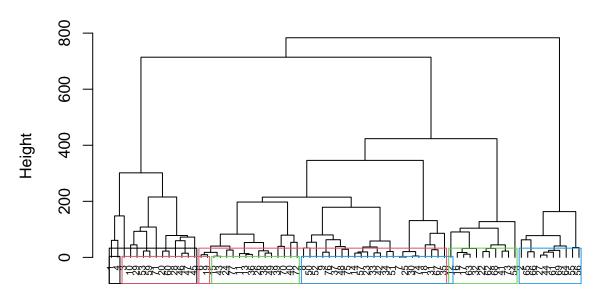
```
print(dataaverage$ac)
## [1] 0.8792621
print(dataward$ac)
## [1] 0.9597071
# We would choose ward as it results in the highest agglomerative coefficient.
datacut <- cutree(dataclust, k = 4)</pre>
datacut
## 1 2 3 4 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 22 23 24 25 26 27 28
## 29 30 31 32 33 34 35 36 37 38 39 40 41 42 43 44 45 46 47 48 49 50 51 52 53 54
## 1 3 3 4 3 3 3 3 3 3 3 3 3 3 2 1 1 1 3 3 3 3 3 1 4
## 55 56 57 59 60 61 62 63 64 65 66 67 68 69 70 71 72 73 74 75 76 77
## 2 2 3 1 1 2 4 4 2 2 2 3 4 2 3 1 3 4 3 3 3 3
pltree(dataward, cex = 0.6, hang = -1, main = "Dendrogram")
rect.hclust(dataward, k = 4, border = 1:4)
# 2
# I am choosing 4 clusters, but noting that the front and back clusters stay
# roughly the same when k = 3, 4 or 5. The values inbetween the aforementioned
# clusters become 1-3 clusters depending on k being 3, 4 or 5.
# 3
library(caret)
## Warning: package 'caret' was built under R version 4.2.3
## Loading required package: ggplot2
## Warning: package 'ggplot2' was built under R version 4.2.3
## Loading required package: lattice
library(class)
## Warning: package 'class' was built under R version 4.2.3
set.seed(123)
IndexData <- createDataPartition(data$rating, p=0.7, list=FALSE)</pre>
DataPart7 <- data[IndexData,]</pre>
DataPart3 <- data[-IndexData,]</pre>
```

```
DataPart7 <- as.data.frame(DataPart7)
DataPart3 <- as.data.frame(DataPart3)

DataPart7 <- scale(DataPart7)
DataPart3 <- scale(DataPart3)

dataward7 <- agnes(DataPart7, method = "ward")
rect.hclust(dataward7, k = 4, border = 1:4)</pre>
```

Dendrogram



data agnes (*, "ward")

```
d<-dist(DataPart7)
fit.ward<-hclust(d, method = "ward")</pre>
```

The "ward" method has been renamed to "ward.D"; note new "ward.D2"

```
clusters<-cutree(fit.ward, k=4)

clustercenter <- aggregate(DataPart7,list(cluster=clusters),mean)
clustercenter[,2:14]</pre>
```

```
## calories protein fat sodium fiber carbo

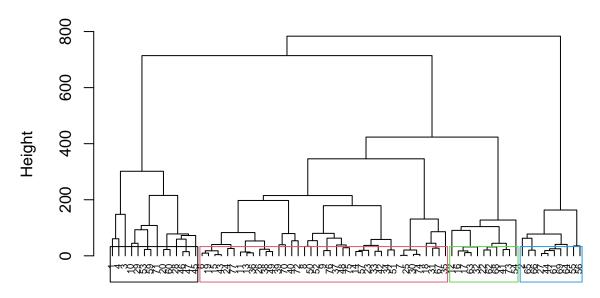
## 1 0.676039939 0.62851038 0.88154309 -0.06670409 1.00166593 -0.3459942

## 2 0.159595635 -0.92202792 0.07259767 0.14473529 -0.67554214 -0.5957761

## 3 -0.006404319 0.39880101 -0.58522608 1.16687207 -0.67323828 1.3156502
```

```
## 4 -0.734688434 0.09477389 -0.60091345 -0.54932779 -0.01054052 0.2892355
##
                                           shelf
                                                     weight
         sugars potass vitamins
                                                                  cups
                                                                            rating
## 1 0.4727782 1.1922410 0.1380093 0.8041672 0.8665950 -0.6072387 -0.05335428
## 2 0.9817880 -0.6777884 -0.2168718 -0.5423453 -0.1797086 0.1876919 -1.06226961
## 3 -1.0951537 -0.7313607 -0.2168718 -1.4560502 -0.1797086 1.1510721 0.24871606
## 4 -0.8324951 -0.1527802 0.1588847 0.3685308 -0.5320785 -0.1037826 0.88196153
assignedclusterlabels <- character(nrow(DataPart3))</pre>
for (i in 1:nrow(DataPart3)) {
  distances <- apply(clustercenter[, -1], 1, function(c) sqrt(sum((unlist(DataPart3[i,]) - c)^2)))</pre>
  closestcluster <- which.min(distances)</pre>
  assignedclusterlabels[i] <- as.character(clustercenter$cluster[closestcluster])
}
for (i in 1:nrow(DataPart3)) {
  cat("Record", paste(DataPart3[i,], collapse = " "), "assigned to Cluster", assignedclusterlabels[i],
## Record -3.06488136113741 1.87747262960169 -1.04586074656009 -0.205582433755664 3.52752070562171 -1.6
## Record 0.437840194448202 -0.545072698916619 1.41498806887541 0.392475555351723 -0.391946745069079 -0
## Record 0.437840194448202 -0.545072698916619 -1.04586074656009 -0.429854179670935 -0.548725443096711
## Record -0.72973365741367 -0.545072698916619 0.184563661157662 0.691504549905417 0.391946745069079 0.
## Record -0.72973365741367 0.666199965342534 -1.04586074656009 0.841019047182263 0.705504141124343 -0.
## Record 0.437840194448202 0.666199965342534 1.41498806887541 -0.205582433755664 -0.235168047041448 -0
## Record 0.437840194448202 -0.545072698916619 -1.04586074656009 0.99053354445911 -0.548725443096711 1.
## Record 0.437840194448202 -1.75634536317577 -1.04586074656009 0.691504549905417 -0.548725443096711 0.
## Record 1.02162712037914 0.666199965342534 1.41498806887541 0.0934465607980293 0.705504141124343 -0.5
## Record 0.437840194448202 -1.75634536317577 0.184563661157662 -0.280339682394088 -0.862282839151974 -
## Record -0.145946731482734 -0.545072698916619 -1.04586074656009 -1.62597015788571 -0.862282839151974
## Record -0.145946731482734 1.87747262960169 1.41498806887541 -0.0560679364788176 -0.235168047041448 -
## Record 0.437840194448202 -0.545072698916619 0.184563661157662 0.392475555351723 -0.862282839151974 -
## Record -0.145946731482734 -0.545072698916619 0.184563661157662 0.99053354445911 -0.235168047041448 0
## Record 1.60541404631007 0.666199965342534 1.41498806887541 0.242961058074876 -0.391946745069079 -0.1
## Record 1.02162712037914 0.666199965342534 0.184563661157662 0.691504549905417 1.01906153717961 -0.83
## Record -1.31352058334461 -0.545072698916619 -1.04586074656009 -2.29878539563152 0.0783893490138158 0
## Record -0.72973365741367 0.666199965342534 -1.04586074656009 -2.29878539563152 0.0783893490138158 1.
## Record 0.437840194448202 -0.545072698916619 0.184563661157662 0.691504549905417 -0.862282839151974 1
## Record -0.145946731482734 0.666199965342534 0.184563661157662 0.691504549905417 0.0783893490138158 0
# Cluster Assessment
pltree(dataward, cex = 0.6, hang = -1, main = "Dendrogram")
rect.hclust(dataward, k = 4, border = 1:4)
```

Dendrogram



data agnes (*, "ward")

In review, only 6 out of 20 values were correctly assigned. With a 30% # accuracy, this is not very consistent and would indicate a rather low # stability.

#4

#I would be inclined to not normalize the data as we are focused on the #real-world implications and the real measurements of the variables as opposed #to the normalized ones, however it does open up the risk of our results not #being entirely correct. Regarding the school lunch example, I am assuming that #the cluster or dendrogram info will be given to the lunch staff. I wouldn't #expect the lunch staff to know what to do with the normalized values. Being #said, some options would be to perform calculations with the normalized data #and simply provide the dendrogram results or just provide the cereals that #make up the best cluster.

#It would also be possible to avoid clustering entirely and evaluate #which cereals to choose based off rating, which does appear #to be representative of the general health of the cereal.