### **Assignment 5**

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```
#Reading the directory
getwd()
## [1] "C:/Users/Nikesh/Downloads"
#Reading the file
Assign <-read.csv("Cereals.csv")</pre>
#Required packages
library(dplyr)
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
library(cluster)
library(fpc)
library(caret)
## Loading required package: ggplot2
## Loading required package: lattice
library(dendextend)
##
## Welcome to dendextend version 1.15.2
## Type citation('dendextend') for how to cite the package.
## Type browseVignettes(package = 'dendextend') for the package vignette.
## The github page is: https://github.com/talgalili/dendextend/
## Suggestions and bug-reports can be submitted at:
https://github.com/talgalili/dendextend/issues
```

```
## You may ask questions at stackoverflow, use the r and dendextend tags:
     https://stackoverflow.com/questions/tagged/dendextend
##
##
##
  To suppress this message use:
suppressPackageStartupMessages(library(dendextend))
##
## Attaching package: 'dendextend'
## The following object is masked from 'package:stats':
##
##
      cutree
library(knitr)
library(factoextra)
## Welcome! Want to learn more? See two factoextra-related books at
https://goo.gl/ve3WBa
library(tidytext)
#Data in brief
summary(Assign)
                          mfr
                                                               calories
##
       name
                                             type
                      Length:77
                                         Length:77
## Length:77
                                                           Min.
                                                                  : 50.0
                      Class :character
##
   Class :character
                                         Class :character
                                                            1st Qu.:100.0
## Mode :character
                      Mode :character
                                         Mode :character
                                                            Median:110.0
##
                                                            Mean
                                                                   :106.9
##
                                                            3rd Qu.:110.0
##
                                                            Max.
                                                                   :160.0
##
##
      protein
                        fat
                                       sodium
                                                       fiber
                   Min.
                          :0.000
                                   Min.
                                        : 0.0
                                                   Min.
                                                        : 0.000
## Min.
          :1.000
                                   1st Ou.:130.0
                   1st Ou.:0.000
                                                   1st Ou.: 1.000
   1st Ou.:2.000
## Median :3.000
                   Median :1.000
                                   Median :180.0
                                                   Median : 2.000
## Mean
          :2.545
                   Mean
                          :1.013
                                   Mean
                                         :159.7
                                                   Mean : 2.152
## 3rd Qu.:3.000
                   3rd Qu.:2.000
                                   3rd Qu.:210.0
                                                   3rd Qu.: 3.000
## Max.
          :6.000
                   Max.
                          :5.000
                                   Max.
                                         :320.0
                                                   Max.
                                                          :14.000
##
##
       carbo
                                       potass
                                                       vitamins
                      sugars
## Min. : 5.0
                  Min. : 0.000
                                   Min.
                                         : 15.00
                                                    Min. : 0.00
   1st Qu.:12.0
                  1st Qu.: 3.000
                                   1st Qu.: 42.50
                                                    1st Qu.: 25.00
##
## Median :14.5
                  Median : 7.000
                                   Median : 90.00
                                                    Median : 25.00
## Mean
          :14.8
                  Mean
                        : 7.026
                                   Mean
                                         : 98.67
                                                    Mean
                                                           : 28.25
##
   3rd Qu.:17.0
                  3rd Qu.:11.000
                                   3rd Qu.:120.00
                                                    3rd Qu.: 25.00
## Max.
          :23.0
                  Max.
                         :15.000
                                   Max.
                                          :330.00
                                                    Max. :100.00
   NA's
                  NA's
                                   NA's
##
          :1
                         :1
                                          :2
##
       shelf
                       weight
                                                      rating
                                       cups
```

Min. :0.250

Min. :18.04

## Min. :1.000 Min. :0.50

```
1st Ou.:1.000
                     1st Ou.:1.00
                                     1st Ou.:0.670
                                                      1st Ou.:33.17
##
    Median :2.000
                     Median :1.00
                                     Median :0.750
                                                      Median :40.40
##
    Mean
           :2.208
                     Mean
                            :1.03
                                     Mean
                                             :0.821
                                                      Mean
                                                              :42.67
##
    3rd Qu.:3.000
                     3rd Qu.:1.00
                                                      3rd Qu.:50.83
                                     3rd Qu.:1.000
##
    Max.
           :3.000
                     Max.
                             :1.50
                                     Max.
                                             :1.500
                                                      Max.
                                                              :93.70
##
head(Assign)
##
                           name mfr type calories protein fat sodium fiber
carbo
## 1
                      100%_Bran
                                   N
                                        C
                                                 70
                                                               1
                                                                    130
                                                                         10.0
5.0
             100%_Natural_Bran
                                                          3
                                                               5
## 2
                                   Q
                                        C
                                                120
                                                                     15
                                                                          2.0
8.0
## 3
                       All-Bran
                                   Κ
                                        C
                                                 70
                                                          4
                                                               1
                                                                    260
                                                                          9.0
7.0
                                   Κ
                                        C
                                                          4
                                                               0
                                                                    140
                                                                         14.0
## 4 All-Bran_with_Extra_Fiber
                                                 50
8.0
## 5
                Almond_Delight
                                   R
                                        C
                                                          2
                                                               2
                                                                    200
                                                                          1.0
                                                110
14.0
                                                          2
       Apple Cinnamon Cheerios
                                        C
                                                               2
## 6
                                                110
                                                                    180
                                                                          1.5
10.5
##
     sugars potass vitamins shelf weight cups
                                                   rating
## 1
                280
                          25
                                  3
          6
                                         1 0.33 68.40297
## 2
          8
                135
                           0
                                  3
                                         1 1.00 33.98368
## 3
          5
                          25
                                  3
                320
                                         1 0.33 59.42551
                                  3
## 4
          0
                330
                          25
                                         1 0.50 93.70491
## 5
          8
                 NA
                          25
                                  3
                                         1 0.75 34.38484
## 6
         10
                 70
                          25
                                  1
                                         1 0.75 29.50954
```

#Eliminating mrf and type from the dataset(character data)

```
Assign_New <-select(Assign,-c('mfr','type'))
```

#Cheacking the new dataset after eliminating the data

```
head(Assign_New)
##
                            name calories protein fat sodium fiber carbo sugars
## 1
                      100% Bran
                                        70
                                                  4
                                                      1
                                                           130
                                                                 10.0
                                                                         5.0
                                                                                  6
                                                      5
## 2
              100% Natural Bran
                                       120
                                                  3
                                                            15
                                                                  2.0
                                                                         8.0
                                                                                  8
## 3
                       All-Bran
                                        70
                                                  4
                                                      1
                                                           260
                                                                  9.0
                                                                         7.0
                                                                                  5
                                                                                  0
## 4 All-Bran with Extra Fiber
                                        50
                                                  4
                                                      0
                                                           140
                                                                 14.0
                                                                         8.0
## 5
                 Almond_Delight
                                       110
                                                  2
                                                      2
                                                           200
                                                                  1.0
                                                                       14.0
                                                                                  8
                                                      2
## 6
       Apple_Cinnamon_Cheerios
                                                  2
                                                                                 10
                                       110
                                                           180
                                                                  1.5
                                                                       10.5
     potass vitamins shelf weight cups
##
                                            rating
## 1
        280
                   25
                           3
                                  1 0.33 68.40297
## 2
                    0
                           3
        135
                                  1 1.00 33.98368
## 3
        320
                   25
                           3
                                  1 0.33 59.42551
                                  1 0.50 93.70491
## 4
        330
                   25
                           3
```

## 5	NA	25	3	1 0.75 34.38484	
	70	25		1 0.75 29.50954	

#Eliminating name from dataset and changing row number as name to avoid duplication

```
rownames(Assign_New)<-Assign_New$name
Assign_New$name=NULL
```

#Normalizing the data

```
Assign_New<-as.data.frame(scale(Assign_New))
```

#Preprocessing the data

```
sum(is.na(Assign_New))
## [1] 4
Assign_New<-na.omit(Assign_New)</pre>
```

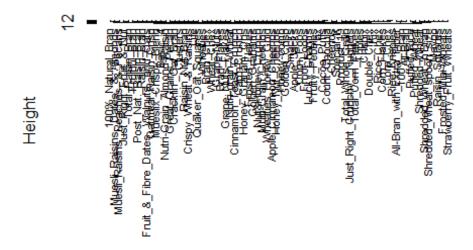
#Calculation of Dissimilarity Matrix and performing Hierarchial Clustering

```
Dis <- dist(Assign_New, method = "euclidean")
H_clust <- hclust(Dis, method = "complete")</pre>
```

#Plotting the dendogram

```
plot(H_clust, cex = 0.7, hang = -1)
```

#### **Cluster Dendrogram**



Dis hclust (\*, "complete")

#Q1. Apply hierarchical clustering to the data using Euclidean distance to the normalized measurements. Use Agnes to compare the clustering from single linkage, complete linkage, average linkage, and Ward. Choose the best method.

#Single linkage: computes the minimum distance between clusters before merging them.

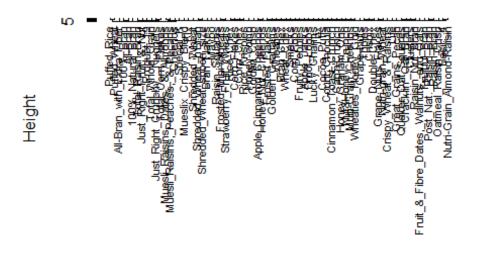
#Complete linkage: computes the maximum distance between clusters before merging them.

#Average linkage: computes the average distance between clusters before merging them.

#Ward's (minimum variance) criterion: minimizes the total within-cluster variance and find the pair of clusters that leads to minimum increase in total within-cluster variance after merging.

```
hc_S <- hclust(Dis,method="single")
plot(hc_S,cex=0.7,hang=-1)</pre>
```

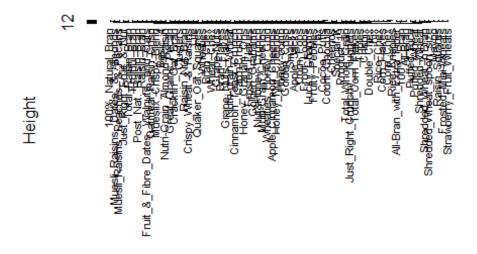
#### Cluster Dendrogram



Dis hclust (\*, "single")

```
hc_C<- hclust(Dis,method="complete")
plot(hc_C,cex=0.7,hang=-1)</pre>
```

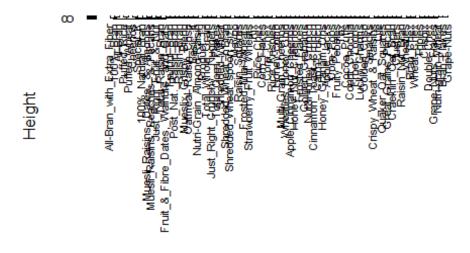
# **Cluster Dendrogram**



Dis hclust (\*, "complete")

hc\_A <- hclust(Dis,method="average")
plot(hc\_A,cex=0.7,hang=-1)</pre>

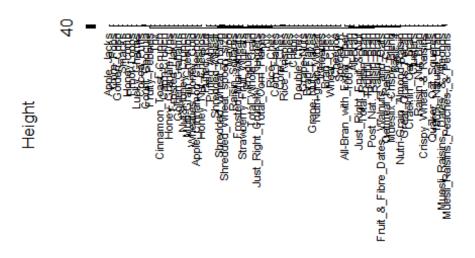
# **Cluster Dendrogram**



Dis hclust (\*, "average")

```
hc_W <- hclust(Dis,method="ward.D")
plot(hc_W,cex=0.7,hang=-1)</pre>
```

#### Cluster Dendrogram



Dis hclust (\*, "ward.D")

#Computation with Agnes and Single Linkage vs Complete Linkage vs Average Linkage vs Ward

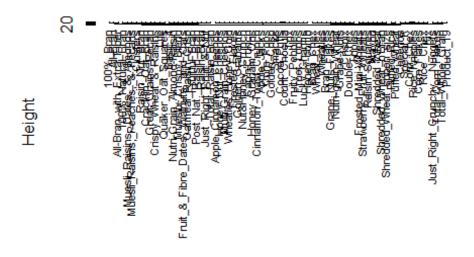
```
hc_S <- agnes(Dis,method="single")
print(hc_S$ac)
## [1] 0.6094447
hc_C <- agnes(Dis,method="complete")
print(hc_C$ac)
## [1] 0.8413498
hc_A <- agnes(Dis,method="average")
print(hc_A$ac)
## [1] 0.7814484
hc_W <- agnes(Dis,method="ward")
print(hc_W$ac)
## [1] 0.9049881</pre>
```

#The Best Linkage method is Ward with Agglomerative coefficient of 0.9049881.

#Dendrogram of Ward

```
pltree(hc_W,cex=0.7,hang=-1,main="Ward")
```

### Ward

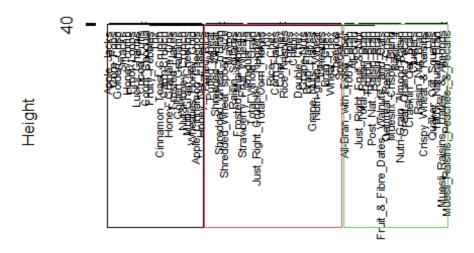


Dis agnes (\*, "ward")

#Q2 Choosing the number of clusters

```
Diss <-dist(Assign_New,method="euclidean")
hc_W<- hclust(Diss,method="ward.D")
plot(hc_W,cex=0.7)
rect.hclust(hc_W,k=3,border=1:3)</pre>
```

#### Cluster Dendrogram



Diss hclust (\*, "ward.D")

```
cluster1<-cutree(hc_W, k=3)
dataframe2 <- as.data.frame(cbind(Assign_New, cluster1))</pre>
```

#The optimal number of clusters is 3 by the longest distance and the partition.

#Q3. Stability of clusters #Comment on the structure of the clusters and on their stability. Hint: To check stability,partition the data and see how well clusters formed based on one part apply to the other part. To do this:

- Cluster partition A
- Use the cluster centroids from A to assign each record in partition B (each record is assigned to the cluster with the closest centroid).
- Assess how consistent the cluster assignments are compared to the assignments based on all the data.

```
set.seed(123)
kmeans_clust <- kmeans(Assign_New,3,nstart=10)
km_data <- kmeans_clust$cluster
cereal_cluster <- as.data.frame(cbind(kmeans_clust$cluster,Assign_New))
colnames(cereal_cluster)[1]<-"cluster"
print_clusters <-function(labels,k)
{
    for(i in 1:3)
    {
        print(paste("cluster", i))</pre>
```

```
print(cereal_cluster[labels==i,c("cluster","calories" ,"protein" , "fat"
"sodium" , "fiber" , "carbo" , "sugars" , "potass" , "vitamins"
,"shelf" , "weight" , "cups" , "rating" )])
  }
groups <- cutree(hc_W, k=3)
print_clusters(groups,3)
## [1] "cluster 1"
                                         cluster calories protein
##
## 100%_Bran
                                              3 -1.8929836 1.3286071
                                               1 0.6732089 0.4151897
## 100% Natural Bran
## All-Bran
                                              3 -1.8929836 1.3286071
## All-Bran_with_Extra_Fiber
                                              3 -2.9194605 1.3286071
                                              1 1.1864474 0.4151897
## Basic 4
## Clusters
                                              1 0.1599704 0.4151897
## Cracklin'_Oat_Bran
                                               1 0.1599704 0.4151897
## Crispy_Wheat_&_Raisins
                                              2 -0.3532681 -0.4982277
## Fruit_&_Fibre_Dates,_Walnuts,_and_Oats 1 0.6732089 0.4151897
## Fruitful Bran
                                              1 0.6732089 0.4151897
## Great_Grains_Pecan
                                               1 0.6732089 0.4151897
## Just_Right_Fruit_&_Nut
                                              1 1.6996859 0.4151897
                                              3 -0.3532681 1.3286071
## Muesli_Raisins,_Dates,_&_Almonds
                                              1 2.2129244 1.3286071
                                             1 2.2129244 1.3286071
## Muesli_Raisins,_Peaches,_&_Pecans
## Mueslix_Crispy_Blend
                                              1 2.7261629 0.4151897
## Nutri-Grain Almond-Raisin
                                              1 1.6996859 0.4151897
                                              1 1.1864474 0.4151897
## Oatmeal_Raisin_Crisp
## Post_Nat._Raisin_Bran
                                              1 0.6732089 0.4151897
                                               3 -0.3532681 1.3286071
## Quaker_Oat_Squares
## Raisin_Bran
                                               1 0.6732089 0.4151897
                                               1 -0.3532681 0.4151897
## Raisin_Nut_Bran
                                               1 1.6996859 0.4151897
## Total_Raisin_Bran
##
                                                 fat sodium
fiber
                                         -0.01290349 -0.353984399
## 100%_Bran
3.29284661
## 100%_Natural_Bran
                                         3.96137277 -1.725770770 -
0.06375361
## All-Bran
                                         -0.01290349 1.196730628
2.87327158
## All-Bran_with_Extra_Fiber
                                         -1.00647256 -0.234698628
4.97114672
                                          0.98066557 0.600301771 -
## Basic 4
0.06375361
## Clusters
                                          0.98066557 -0.234698628 -
0.06375361
## Cracklin'_Oat_Bran
                                          1.97423464 -0.234698628
0.77539645
```

## Cnicny Wheat & Daisins	0.01200240	-0.234698628	
<pre>## Crispy_Wheat_&amp;_Raisins 0.06375361</pre>	-0.01290349	-0.234698628	-
<pre>## Fruit_&amp;_Fibre_Dates,_Walnuts,_and_Oats 1.19497147</pre>	0.98066557	0.003872915	
<pre>## Fruitful_Bran 1.19497147</pre>	-1.00647256	0.958159085	
## Great_Grains_Pecan 0.35582142	1.97423464	-1.010056142	
## Just_Right_Fruit_&_Nut 0.06375361	-0.01290349	0.123158686	-
## Life	0.98066557	-0.115412857	-
<pre>0.06375361 ## Muesli_Raisins,_Dates,_&amp;_Almonds 0.35582142</pre>	1.97423464	-0.771484599	
<pre>## Muesli_Raisins,_Peaches,_&amp;_Pecans 0.35582142</pre>	1.97423464	-0.115412857	
## Mueslix_Crispy_Blend 0.35582142	0.98066557	-0.115412857	
## Nutri-Grain_Almond-Raisin 0.35582142	0.98066557	0.719587543	
## Oatmeal_Raisin_Crisp 0.27354112	0.98066557	0.123158686	-
## Post_NatRaisin_Bran 1.61454650	-0.01290349	0.481016000	
## Quaker_Oat_Squares 0.06375361	-0.01290349	-0.294341514	-
## Raisin_Bran 1.19497147	-0.01290349	0.600301771	
## Raisin_Nut_Bran 0.14603391	0.98066557	-0.234698628	
## Total_Raisin_Bran	-0.01290349	0.361730229	
0.77539645 ##	carbo	sugars	
potass ## 100%_Bran	-2.50878291	-0.234390576	
2.57536849 ## 100%_Natural_Bran	-1.74099432	0.222370547	
0.51602052 ## All-Bran	-1.99692385	-0.462771138	
3.14346448 ## All-Bran_with_Extra_Fiber	-1.74099432	-1.604673946	
3.28548848 ## Basic_4	0.81830100	0.222370547	
0.01893653 ## Clusters	-0.46134666	-0.006010015	
0.08994853 ## Cracklin'_Oat_Bran	-1.22913525	-0.006010015	
<pre>0.87108052 ## Crispy_Wheat_&amp;_Raisins 0.30298453</pre>	-0.97320572	0.679131670	
0.30230433			

```
## Fruit_&_Fibre_Dates,_Walnuts,_and_Oats -0.71727619 0.679131670
1.43917651
                                   -0.20541712 1.135892793
## Fruitful Bran
1.29715251
                                 -0.46134666 -0.691151699
## Great_Grains_Pecan
0.01893653
## Just_Right_Fruit_&_Nut
                                   1.33016007 0.450751108 -
0.05207547
## Life
                                  -0.71727619 -0.234390576 -
0.05207547
1.01310452
## Muesli_Raisins,_Peaches,_&_Pecans 0.30644194 0.907512232
1.01310452
## Mueslix_Crispy_Blend
                             0.56237147 1.364273355
0.87108052
## Nutri-Grain_Almond-Raisin
                                   1.58608960 -0.006010015
0.44500853
## Oatmeal_Raisin_Crisp -0.33338189 0.679131670
0.30298453
## Post_Nat._Raisin_Bran
                                  -0.97320572 1.592653916
2.29132050
## Quaker_Oat_Squares
                                  -0.20541712 -0.234390576
0.16096053
                                   -0.20541712 1.135892793
## Raisin Bran
2.00727250
                                   -1.10117049 0.222370547
## Raisin Nut Bran
0.58703252
## Total_Raisin_Bran
                                    0.05051241 1.592653916
1.86524850
##
                                     vitamins
                                                 shelf weight
## 100%_Bran
                                   -0.1453172  0.9515734  -0.1967771
## 100%_Natural_Bran
                                   -1.2642598 0.9515734 -0.1967771
## All-Bran
                                  -0.1453172 0.9515734 -0.1967771
## All-Bran_with_Extra_Fiber
                                   ## Basic 4
                                   -0.1453172 0.9515734 1.9962520
                                   -0.1453172  0.9515734  -0.1967771
## Clusters
## Cracklin'_Oat_Bran
                                   -0.1453172  0.9515734  -0.1967771
## Crispy_Wheat_&_Raisins
                                  -0.1453172 0.9515734 -0.1967771
## Fruit_&_Fibre_Dates,_Walnuts,_and_Oats -0.1453172 0.9515734 1.4646086
## Fruitful Bran
                                   -0.1453172 0.9515734 1.9962520
## Great_Grains_Pecan
                                   -0.1453172 0.9515734 -0.1967771
## Just_Right_Fruit_&_Nut
                                   3.2115106 0.9515734 1.7968857
## Life
                                   -0.1453172 -0.2495930 -0.1967771
## Mueslix_Crispy_Blend
                                   -0.1453172  0.9515734  3.1259942
## Nutri-Grain_Almond-Raisin
                                   -0.1453172 0.9515734 1.9962520
                                   -0.1453172 0.9515734 1.4646086
## Oatmeal_Raisin_Crisp
## Post_Nat._Raisin_Bran
                                 -0.1453172 0.9515734 1.9962520
```

```
-0.1453172 0.9515734 -0.1967771
## Quaker_Oat_Squares
## Raisin Bran
                                         -0.1453172 -0.2495930 1.9962520
                                         -0.1453172 0.9515734 -0.1967771
## Raisin_Nut_Bran
                                         3.2115106 0.9515734 3.1259942
## Total_Raisin_Bran
##
                                               cups
                                                       rating
                                         -2.1100340 1.8321876
## 100%_Bran
## 100%_Natural_Bran
                                         0.7690100 -0.6180571
                                         -2.1100340 1.1930986
## All-Bran
## All-Bran_with_Extra_Fiber
                                         -1.3795303 3.6333849
## Basic 4
                                         -0.3052601 -0.4005857
## Clusters
                                         -1.3795303 -0.1612765
## Cracklin'_Oat_Bran
                                         -1.3795303 -0.1578193
## Crispy_Wheat_&_Raisins
                                        -0.3052601 -0.4619759
## Fruit_&_Fibre_Dates,_Walnuts,_and_Oats -0.6490266 -0.1244837
                                         -0.6490266 -0.1174756
## Fruitful_Bran
## Great_Grains_Pecan
                                         -2.1100340 0.2239586
## Just_Right_Fruit_&_Nut
                                         -0.3052601 -0.4409529
## Life
                                         -0.6490266 0.1895290
## Muesli_Raisins,_Dates,_&_Almonds
                                         0.7690100 -0.3935878
## Muesli_Raisins,_Peaches,_&_Pecans
                                         0.7690100 -0.6069456
## Mueslix_Crispy_Blend
                                         -0.6490266 -0.8793408
## Nutri-Grain_Almond-Raisin
                                         -0.6490266 -0.1404816
## Oatmeal_Raisin_Crisp
                                         -1.3795303 -0.8695530
## Post_Nat._Raisin_Bran
                                         -0.6490266 -0.3434906
## Quaker_Oat_Squares
                                         -1.3795303 0.4873659
## Raisin_Bran
                                         -0.3052601 -0.2425029
## Raisin Nut Bran
                                        -1.3795303 -0.2108809
## Total_Raisin_Bran
                                         0.7690100 -1.0018246
## [1] "cluster 2"
##
                          cluster calories
                                                               fat
                                               protein
sodium
## Apple_Cinnamon_Cheerios 2 0.1599704 -0.4982277 0.98066557
0.2424445
## Apple_Jacks
                              2 0.1599704 -0.4982277 -1.00647256 -
0.4136273
                              2 0.6732089 -1.4116451 0.98066557
## Cap'n'Crunch
0.7195875
## Cinnamon_Toast_Crunch 2 0.6732089 -1.4116451 1.97423464
0.6003018
                               2 0.1599704 -1.4116451 -0.01290349
## Cocoa_Puffs
0.2424445
## Corn Pops
                               2 0.1599704 -1.4116451 -1.00647256 -
0.8311275
                               2 0.1599704 -1.4116451 -0.01290349
## Count_Chocula
0.2424445
## Froot Loops
                               2 0.1599704 -0.4982277 -0.01290349 -
0.4136273
## Frosted_Flakes
                               2 0.1599704 -1.4116451 -1.00647256
0.4810160
                  2 0.1599704 -1.4116451 -0.01290349 -
## Fruity_Pebbles
```

```
0.2943415
                                         2 -0.3532681 -0.4982277 -1.00647256 -
## Golden Crisp
1.3679135
                                         2 0.1599704 -1.4116451 -0.01290349
## Golden Grahams
1.4353022
                            2 0.6732089 -1.4116451 0.98066557
## Honey_Graham_Ohs
0.7195875
## Honey_Nut_Cheerios 2 0.1599704 0.4151897 -0.01290349
1.0774449
                                         2 0.1599704 -1.4116451 -1.00647256
## Honey-comb
0.2424445
                                       2 0.1599704 -0.4982277 -0.01290349
## Lucky Charms
0.2424445
## Multi-Grain_Cheerios 2 -0.3532681 -0.4982277 -0.01290349
0.7195875
                                        2 0.6732089 -0.4982277 -0.01290349
## Nut&Honey_Crunch
0.3617302
                                         2 0.1599704 -0.4982277 -0.01290349 -
## Smacks
1.0696990
## Trix
                                         2 0.1599704 -1.4116451 -0.01290349 -
0.2346986
## Wheaties_Honey_Gold
                                         2 0.1599704 -0.4982277 -0.01290349
0.4810160
##
                                         fiber
                                                        carbo
                                                                    sugars
                                                                                  potass
## Apple Cinnamon Cheerios -0.27354112 -1.10117049 0.6791317 -0.4071355
## Apple_Jacks -0.48332864 -0.97320572 1.5926539 -0.9752315
## Cap'n'Crunch -0.90290366 -0.71727619 1.1358928 -0.9042195
## Cinnamon_Toast_Crunch -0.90290366 -0.46134666 0.4507511 -0.7621955
## Cocoa Puffs
                      -0.90290366 -0.71727619 1.3642734 -0.6201715
                                -0.48332864 -0.46134666 1.1358928 -1.1172554
## Corn Pops
## Corn_Pops
-0.48332864 -0.46134666 1.1358928 -1.1172554

## Count_Chocula
-0.90290366 -0.71727619 1.3642734 -0.4781475

## Froot_Loops
-0.48332864 -0.97320572 1.3642734 -0.9752315

## Frosted_Flakes
-0.48332864 -0.20541712 0.9075122 -1.0462434

## Fruity_Pebbles
-0.90290366 -0.46134666 1.1358928 -1.0462434

## Golden_Crisp
-0.90290366 -0.97320572 1.8210345 -0.8332075

## Golden_Grahams
-0.90290366 -0.97320572 0.4507511 -0.7621955

## Honey_Graham_Ohs
-0.48332864 -0.71727619 0.9075122 -0.7621955

## Honey_Nut_Cheerios
-0.27354112 -0.84524095 0.6791317 -0.1230875

## Honey-comb
                                -0.90290366 -0.20541712 0.9075122 -0.9042195
## Honey-comb
                                -0.90290366 -0.71727619 1.1358928 -0.6201715
## Lucky_Charms
## Multi-Grain_Cheerios -0.06375361 0.05051241 -0.2343906 -0.1230875
                                 ## Nut&Honey_Crunch
## Smacks
                                 -0.48332864 -1.48506478 1.8210345 -0.8332075
                                 -0.90290366 -0.46134666 1.1358928 -1.0462434
## Trix
## Wheaties Honey Gold
                                 -0.48332864 0.30644194
                                                                0.2223705 -0.5491595
##
                                    vitamins
                                                    shelf
                                                                 weight
                                                                                 cups
rating
## Apple_Cinnamon_Cheerios -0.1453172 -1.450759 -0.1967771 -0.3052601 -
0.9365625
## Apple_Jacks -0.1453172 -0.249593 -0.1967771 0.7690100 -
```

```
0.6756899
                        -0.1453172 -0.249593 -0.1967771 -0.3052601 -
## Cap'n'Crunch
1.7528545
## Cinnamon_Toast_Crunch -0.1453172 -0.249593 -0.1967771 -0.3052601 -
1.6260883
                 -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Cocoa Puffs
1.4187264
## Corn_Pops
                         -0.1453172 -0.249593 -0.1967771 0.7690100 -
0.4899817
## Count Chocula -0.1453172 -0.249593 -0.1967771 0.7690100 -
1.4429256
                        -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Froot Loops
0.7444941
## Frosted_Flakes -0.1453172 -1.450759 -0.1967771 -0.3052601 -
0.7994234
                     -0.1453172 -0.249593 -0.1967771 -0.3052601 -
## Fruity_Pebbles
1.0421897
                    -0.1453172 -1.450759 -0.1967771 0.2533603 -
## Golden_Crisp
0.5277361
## Golden Grahams -0.1453172 -0.249593 -0.1967771 -0.3052601 -
1.3427262
## Honey_Graham_Ohs -0.1453172 -0.249593 -0.1967771 0.7690100 -
1.4803151
## Honey_Nut_Cheerios -0.1453172 -1.450759 -0.1967771 -0.3052601 -
0.8253186
## Honey-comb
                        -0.1453172 -1.450759 -0.1967771 2.1870466 -
0.9911728
                -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Lucky_Charms
1.1341114
## Multi-Grain_Cheerios -0.1453172 -1.450759 -0.1967771 0.7690100 -
0.1822231
## Nut&Honey_Crunch -0.1453172 -0.249593 -0.1967771 -0.6490266 -
0.9070377
## Smacks
                        -0.1453172 -0.249593 -0.1967771 -0.3052601 -
0.8140824
                        -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Trix
1.0615859
## Wheaties_Honey_Gold -0.1453172 -1.450759 -0.1967771 -0.3052601 -
0.4611670
## [1] "cluster 3"
##
                             cluster
                                      calories
                                                  protein
## Bran Chex
                                   3 -0.8665066 -0.4982277 -0.01290349
## Bran Flakes
                                   3 -0.8665066 0.4151897 -1.00647256
                                  3 0.1599704 3.1554419 0.98066557
## Cheerios
                                  2 0.1599704 -0.4982277 -1.00647256
## Corn Chex
## Corn_Flakes
                                  2 -0.3532681 -0.4982277 -1.00647256
## Crispix
                                  2 0.1599704 -0.4982277 -1.00647256
## Double Chex
                                 2 -0.3532681 -0.4982277 -1.00647256
## Frosted_Mini-Wheats
                                  3 -0.3532681 0.4151897 -1.00647256
## Grape_Nuts_Flakes
                                  3 -0.3532681 0.4151897 -0.01290349
```

```
## Grape-Nuts
                                    3 0.1599704 0.4151897 -1.00647256
## Just_Right_Crunchy__Nuggets
                                    2 0.1599704 -0.4982277 -0.01290349
## Kix
                                    2 0.1599704 -0.4982277 -0.01290349
## Maypo
                                    3 -0.3532681 1.3286071 -0.01290349
## Nutri-grain_Wheat
                                   3 -0.8665066 0.4151897 -1.00647256
## Product 19
                                    2 -0.3532681 0.4151897 -1.00647256
## Puffed Rice
                                  3 -2.9194605 -1.4116451 -1.00647256
                                 3 -2.9194605 -0.4982277 -1.00647256
3 -0.8665066 -0.4982277 -1.00647256
2 0.1599704 -1.4116451 -1.00647256
## Puffed Wheat
## Raisin_Squares
## Rice Chex
                                  2 0.1599704 -0.4982277 -1.00647256
## Rice_Krispies
## Shredded Wheat
                                   3 -1.3797451 -0.4982277 -1.00647256
## Shredded_Wheat_'n'Bran
                                  3 -0.8665066 0.4151897 -1.00647256
## Shredded_Wheat_spoon_size
                                 3 -0.8665066 0.4151897 -1.00647256
                                    3 0.1599704 3.1554419 -1.00647256
## Special K
## Strawberry_Fruit_Wheats
                                  3 -0.8665066 -0.4982277 -1.00647256
                                   2 0.1599704 -0.4982277 -0.01290349
## Total_Corn_Flakes
## Total Whole Grain
                                  2 -0.3532681 0.4151897 -0.01290349
## Triples
                                   2 0.1599704 -0.4982277 -0.01290349
## Wheat Chex
                                    3 -0.3532681 0.4151897 -0.01290349
## Wheaties
                                    3 -0.3532681 0.4151897 -0.01290349
##
                                               fiber
                                  sodium
                                                           carbo
sugars
## Bran Chex
                        0.4810160 0.77539645 0.05051241 -
0.234390576
## Bran Flakes
                               0.6003018 1.19497147 -0.46134666 -
0.462771138
## Cheerios
                              1.5545879 -0.06375361 0.56237147 -
1.376293384
                              1.4353022 -0.90290366 1.84201913 -
## Corn Chex
0.919532261
## Corn_Flakes
                              1.5545879 -0.48332864 1.58608960 -
1.147912823
                         0.7195875 -0.48332864 1.58608960 -
## Crispix
0.919532261
                              0.3617302 -0.48332864 0.81830100 -
## Double Chex
0.462771138
## Frosted Mini-Wheats -1.9046994 0.35582142 -0.20541712 -
0.006010015
## Grape_Nuts_Flakes
                             -0.2346986   0.35582142   0.05051241 -
0.462771138
## Grape-Nuts
                              0.1231587 0.35582142 0.56237147 -
0.919532261
## Just_Right_Crunchy__Nuggets 0.1231587 -0.48332864 0.56237147 -
0.234390576
## Kix
                              1.1967306 -0.90290366 1.58608960 -
0.919532261
                             -1.9046994 -0.90290366 0.30644194 -
## Maypo
0.919532261
## Nutri-grain_Wheat 0.1231587 0.35582142 0.81830100 -
```

```
1.147912823
## Product_19
                             1.9124453 -0.48332864 1.33016007 -
0.919532261
## Puffed Rice
                            -1.9046994 -0.90290366 -0.46134666 -
1.604673946
## Puffed Wheat
                          -1.9046994 -0.48332864 -1.22913525 -
1.604673946
## Raisin_Squares
                            -1.9046994 -0.06375361 0.05051241 -
0.234390576
## Rice Chex
                            0.9581591 -0.90290366 2.09794866 -
1.147912823
## Rice Krispies
                            1.5545879 -0.90290366 1.84201913 -
0.919532261
## Shredded_Wheat -1.9046994 0.35582142 0.30644194 -
1.604673946
## Shredded_Wheat_'n'Bran -1.9046994 0.77539645 1.07423054 -
1.604673946
## Shredded Wheat spoon size -1.9046994 0.35582142 1.33016007 -
1.604673946
## Special K
                            0.8388733 -0.48332864 0.30644194 -
0.919532261
## Strawberry_Fruit_Wheats -1.7257708 0.35582142 0.05051241 -
0.462771138
## Total_Corn_Flakes 0.4810160 -0.90290366 1.58608960 -
0.919532261
## Total_Whole_Grain
                             0.4810160 0.35582142 0.30644194 -
0.919532261
                             1.0774449 -0.90290366 1.58608960 -
## Triples
0.919532261
                             ## Wheat Chex
0.919532261
## Wheaties
                             0.4810160 0.35582142 0.56237147 -
0.919532261
                                 potass vitamins
                                                       shelf
                                                                weight
                            0.37399653 -0.1453172 -1.4507595 -0.1967771
## Bran Chex
                            1.29715251 -0.1453172 0.9515734 -0.1967771
## Bran Flakes
## Cheerios
                             0.08994853 -0.1453172 -1.4507595 -0.1967771
## Corn_Chex
                           -1.04624345 -0.1453172 -1.4507595 -0.1967771
## Corn_Flakes
                            -0.90421945 -0.1453172 -1.4507595 -0.1967771
## Crispix
                            -0.97523145 -0.1453172 0.9515734 -0.1967771
## Double Chex
                            -0.26511146 -0.1453172 0.9515734 -0.1967771
                             0.01893653 -0.1453172 -0.2495930 -0.1967771
## Frosted Mini-Wheats
## Grape_Nuts_Flakes
                             -0.19409946 -0.1453172 0.9515734 -0.1967771
                             -0.12308746 -0.1453172 0.9515734 -0.1967771
## Grape-Nuts
## Just_Right_Crunchy__Nuggets -0.54915946 3.2115106 0.9515734 -0.1967771
## Kix
                             -0.83320745 -0.1453172 -0.2495930 -0.1967771
## Maypo
                             -0.05207547 -0.1453172 -0.2495930 -0.1967771
## Nutri-grain_Wheat
                             -0.12308746 -0.1453172 0.9515734 -0.1967771
## Product 19
                             -0.76219545 3.2115106 0.9515734 -0.1967771
## Puffed_Rice
                             -1.18826745 -1.2642598 0.9515734 -3.5195485
```

```
## Puffed Wheat
                               -0.69118346 -1.2642598 0.9515734 -3.5195485
## Raisin Squares
                                0.16096053 -0.1453172 0.9515734 -0.1967771
## Rice_Chex
                               -0.97523145 -0.1453172 -1.4507595 -0.1967771
## Rice Krispies
                               -0.90421945 -0.1453172 -1.4507595 -0.1967771
## Shredded_Wheat
                               -0.05207547 -1.2642598 -1.4507595 -1.3265194
## Shredded_Wheat_'n'Bran
                                0.58703252 -1.2642598 -1.4507595 -0.1967771
## Shredded Wheat spoon size
                                0.30298453 -1.2642598 -1.4507595 -0.1967771
## Special K
                               -0.62017146 -0.1453172 -1.4507595 -0.1967771
## Strawberry_Fruit_Wheats
                               -0.12308746 -0.1453172 -0.2495930 -0.1967771
## Total Corn Flakes
                               -0.90421945 3.2115106 0.9515734 -0.1967771
## Total_Whole_Grain
                                0.16096053 3.2115106 0.9515734 -0.1967771
## Triples
                               -0.54915946 -0.1453172 0.9515734 -0.1967771
## Wheat Chex
                                0.23197253 -0.1453172 -1.4507595 -0.1967771
## Wheaties
                                0.16096053 -0.1453172 -1.4507595 -0.1967771
##
                                      cups
                                                rating
## Bran_Chex
                               -0.64902659 0.45948710
## Bran_Flakes
                               -0.64902659 0.75801873
## Cheerios
                                1.84328015
                                            0.57657347
## Corn Chex
                                0.76901001 -0.08689833
## Corn Flakes
                                0.76901001 0.22763247
## Crispix
                                0.76901001 0.30112138
## Double Chex
                               -0.30526014 0.11853896
## Frosted_Mini-Wheats
                               -0.09040611 1.11618949
## Grape Nuts Flakes
                                0.25336034 0.66996501
## Grape-Nuts
                               -2.45380043 0.76209027
## Just_Right_Crunchy__Nuggets 0.76901001 -0.43723896
## Kix
                                2.91755030 -0.24379018
## Maypo
                                0.76901001 0.86744227
## Nutri-grain_Wheat
                                0.76901001 1.20857002
## Product 19
                                0.76901001 -0.08273233
## Puffed Rice
                                0.76901001 1.28782197
## Puffed_Wheat
                                0.76901001 1.44796198
## Raisin_Squares
                               -1.37953029 0.90177096
## Rice Chex
                                1.32763048 -0.04746624
## Rice Krispies
                                0.76901001 -0.14988985
## Shredded Wheat
                                0.76901001 1.82029290
## Shredded_Wheat_'n'Bran
                               -0.64902659 2.26429773
## Shredded_Wheat_spoon_size
                               -0.64902659 2.14533086
## Special K
                                0.76901001 0.74502768
## Strawberry_Fruit_Wheats
                                0.76901001 1.18871964
## Total_Corn_Flakes
                                0.76901001 -0.27236281
## Total Whole Grain
                                0.76901001 0.28426404
## Triples
                               -0.30526014 -0.25339630
## Wheat_Chex
                               -0.64902659 0.50698324
## Wheaties
                                0.76901001 0.63545985
kbest.p<- 3
cboot.hclust <-</pre>
clusterboot(Assign_New,clustermethod=hclustCBI,method="ward.D", k=kbest.p)
```

```
## boot 1
## boot 2
## boot 3
## boot 4
## boot 5
## boot 6
## boot 7
## boot 8
## boot 9
## boot 10
## boot 11
## boot 12
## boot 13
## boot 14
## boot 15
## boot 16
## boot 17
## boot 18
## boot 19
## boot 20
## boot 21
## boot 22
## boot 23
## boot 24
## boot 25
## boot 26
## boot 27
## boot 28
## boot 29
## boot 30
## boot 31
## boot 32
## boot 33
## boot 34
## boot 35
## boot 36
## boot 37
## boot 38
## boot 39
## boot 40
## boot 41
## boot 42
## boot 43
## boot 44
## boot 45
## boot 46
## boot 47
## boot 48
## boot 49
## boot 50
```

```
## boot 51
## boot 52
## boot 53
## boot 54
## boot 55
## boot 56
## boot 57
## boot 58
## boot 59
## boot 60
## boot 61
## boot 62
## boot 63
## boot 64
## boot 65
## boot 66
## boot 67
## boot 68
## boot 69
## boot 70
## boot 71
## boot 72
## boot 73
## boot 74
## boot 75
## boot 76
## boot 77
## boot 78
## boot 79
## boot 80
## boot 81
## boot 82
## boot 83
## boot 84
## boot 85
## boot 86
## boot 87
## boot 88
## boot 89
## boot 90
## boot 91
## boot 92
## boot 93
## boot 94
## boot 95
## boot 96
## boot 97
## boot 98
## boot 99
## boot 100
```

```
groups<-cboot.hclust$result$partition
cboot.hclust$bootmean

## [1] 0.6660267 0.6807289 0.8411100

which.max(cboot.hclust$bootmean)

## [1] 3</pre>
```

#Cluster 3 has highest stability(cluster stability) amongst all. # or #It could also be done in the following way

**#Creating Partitions** 

```
Partion_1 <- Assign_New[1:50,]
Partion_2 <- Assign_New[51:74,]
```

 $\# Performing \ Hierarchial \ Clustering$ , plotting dendogram and then cutting the dendogram by taking k = 3 .

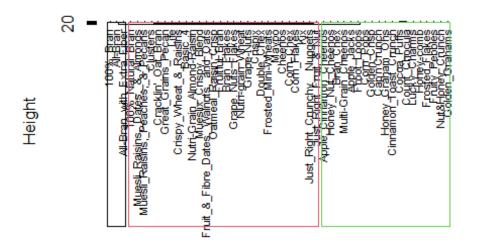
```
ag_single <- agnes(scale(Partion_1), method = "single")
ag_complete <- agnes(scale(Partion_1), method = "complete")
ag_average <- agnes(scale(Partion_1), method = "average")
ag_ward <- agnes(scale(Partion_1), method = "ward")

cbind(single=ag_single$ac , complete=ag_complete$ac , average= ag_average$ac , ward= ag_ward$ac)

## single complete average ward
## [1,] 0.6393338 0.8138238 0.7408904 0.8764323

pltree(ag_ward, cex = 0.7, hang = -1, main = "Dendogram of Agnes with Partitioned Data (Using Ward)")
rect.hclust(ag_ward, k = 3, border = 1:3)</pre>
```

#### Dendogram of Agnes with Partitioned Data (Using W.



scale(Partion\_1) agnes (\*, "ward")

```
cut_2 <- cutree(ag_ward, k = 3)</pre>
```

#Calculating the centeroids.

```
result <- as.data.frame(cbind(Partion_1, cut_2))</pre>
result[result$cut_2==1,]
##
                             calories protein
                                                        fat
                                                                 sodium
fiber
                             -1.892984 1.328607 -0.01290349 -0.3539844
## 100%_Bran
3.292847
                             -1.892984 1.328607 -0.01290349 1.1967306
## All-Bran
2.873272
## All-Bran_with_Extra_Fiber -2.919461 1.328607 -1.00647256 -0.2346986
4.971147
##
                                 carbo
                                           sugars
                                                    potass
                                                             vitamins
shelf
## 100%_Bran
                             -2.508783 -0.2343906 2.575368 -0.1453172
0.9515734
## All-Bran
                             -1.996924 -0.4627711 3.143464 -0.1453172
0.9515734
## All-Bran_with_Extra_Fiber -1.740994 -1.6046739 3.285488 -0.1453172
0.9515734
##
                                 weight
                                             cups
                                                    rating cut 2
## 100% Bran
                             -0.1967771 -2.110034 1.832188
                                                                1
## All-Bran
                             -0.1967771 -2.110034 1.193099
                                                                1
## All-Bran_with_Extra_Fiber -0.1967771 -1.379530 3.633385
                                                                1
```

```
centroid_1 <- colMeans(result[result$cut_2==1,])</pre>
result[result$cut_2==2,]
##
                                          calories
                                                      protein
                                                                     fat
                                         0.6732089 0.4151897 3.96137277
## 100%_Natural_Bran
## Basic_4
                                         1.1864474 0.4151897 0.98066557
                                        -0.8665066 0.4151897 -1.00647256
## Bran_Flakes
## Cheerios
                                         0.1599704 3.1554419 0.98066557
                                         0.1599704 0.4151897 0.98066557
## Clusters
## Corn_Chex
                                         0.1599704 -0.4982277 -1.00647256
## Corn_Flakes
                                         -0.3532681 -0.4982277 -1.00647256
## Cracklin'_Oat_Bran
                                         0.1599704 0.4151897 1.97423464
## Crispix
                                        0.1599704 -0.4982277 -1.00647256
## Crispy_Wheat_&_Raisins
                                        -0.3532681 -0.4982277 -0.01290349
## Double_Chex
                                         -0.3532681 -0.4982277 -1.00647256
                                         -0.3532681 0.4151897 -1.00647256
## Frosted_Mini-Wheats
## Fruit_&_Fibre_Dates,_Walnuts,_and_Oats 0.6732089 0.4151897 0.98066557
                                         0.6732089 0.4151897 -1.00647256
## Fruitful_Bran
## Grape_Nuts_Flakes
                                         -0.3532681 0.4151897 -0.01290349
                                         0.1599704 0.4151897 -1.00647256
## Grape-Nuts
                                         0.6732089 0.4151897 1.97423464
## Great_Grains_Pecan
## Just_Right_Crunchy__Nuggets
                                         0.1599704 -0.4982277 -0.01290349
## Just_Right_Fruit_&_Nut
                                         1.6996859 0.4151897 -0.01290349
## Kix
                                         0.1599704 -0.4982277 -0.01290349
                                         -0.3532681 1.3286071 0.98066557
## Life
## Maypo
                                         -0.3532681 1.3286071 -0.01290349
## Muesli_Raisins,_Dates,_&_Almonds
                                         2.2129244 1.3286071 1.97423464
## Muesli_Raisins,_Peaches,_&_Pecans
                                         2.2129244 1.3286071 1.97423464
## Mueslix_Crispy_Blend
                                         2.7261629 0.4151897 0.98066557
## Nutri-Grain_Almond-Raisin
                                         1.6996859 0.4151897 0.98066557
                                      -0.8665066 0.4151897 -1.00647256
## Nutri-grain_Wheat
## Oatmeal_Raisin_Crisp
                                        1.1864474 0.4151897 0.98066557
##
                                              sodium
                                                           fiber
carbo
## 100%_Natural_Bran
                                        -1.725770770 -0.06375361 -
1.74099432
## Basic_4
                                         0.600301771 -0.06375361
0.81830100
## Bran_Flakes
                                         0.600301771 1.19497147 -
0.46134666
                                         1.554587942 -0.06375361
## Cheerios
0.56237147
                                         -0.234698628 -0.06375361 -
## Clusters
0.46134666
                                         1.435302171 -0.90290366
## Corn_Chex
1.84201913
                                        1.554587942 -0.48332864
## Corn_Flakes
1.58608960
## Cracklin'_Oat_Bran
                                        1.22913525
```

```
## Crispix
                                       0.719587543 -0.48332864
1.58608960
## Crispy_Wheat_&_Raisins
                                      -0.234698628 -0.06375361 -
0.97320572
                                       0.361730229 -0.48332864
## Double_Chex
0.81830100
## Frosted Mini-Wheats
                                      -1.904699427 0.35582142 -
0.20541712
## Fruit & Fibre Dates, Walnuts, and Oats 0.003872915 1.19497147 -
0.71727619
                                       0.958159085 1.19497147 -
## Fruitful_Bran
0.20541712
                                     -0.234698628 0.35582142
## Grape Nuts Flakes
0.05051241
## Grape-Nuts
                                       0.123158686 0.35582142
0.56237147
## Great_Grains_Pecan
                                     -1.010056142 0.35582142 -
0.46134666
## Just_Right_Crunchy__Nuggets 0.123158686 -0.48332864
0.56237147
## Just_Right_Fruit_&_Nut
                                       0.123158686 -0.06375361
1.33016007
## Kix
                                       1.196730628 -0.90290366
1.58608960
                                      -0.115412857 -0.06375361 -
## Life
0.71727619
                                      -1.904699427 -0.90290366
## Maypo
0.30644194
## Muesli_Raisins,_Dates,_&_Almonds -0.771484599 0.35582142
0.30644194
## Muesli_Raisins,_Peaches,_&_Pecans
                                     -0.115412857 0.35582142
0.30644194
                                      -0.115412857 0.35582142
## Mueslix_Crispy_Blend
0.56237147
## Nutri-Grain_Almond-Raisin
                                      0.719587543 0.35582142
1.58608960
## Nutri-grain_Wheat
                                       0.123158686 0.35582142
0.81830100
## Oatmeal_Raisin_Crisp
                                       0.123158686 -0.27354112 -
0.33338189
##
                                                       potass vitamins
                                            sugars
                                       ## 100% Natural Bran
## Basic 4
                                       -0.462771138 1.29715251 -0.1453172
## Bran_Flakes
                                      -1.376293384 0.08994853 -0.1453172
## Cheerios
                                      ## Clusters
## Corn_Chex
                                      -0.919532261 -1.04624345 -0.1453172
## Corn_Flakes
                                      -1.147912823 -0.90421945 -0.1453172
## Cracklin'_Oat_Bran
                                      -0.006010015 0.87108052 -0.1453172
                                      -0.919532261 -0.97523145 -0.1453172
## Crispix
```

```
0.679131670 0.30298453 -0.1453172
## Crispy_Wheat_&_Raisins
## Double Chex
                                         -0.462771138 -0.26511146 -0.1453172
## Frosted_Mini-Wheats
                                         -0.006010015 0.01893653 -0.1453172
## Fruit_&_Fibre_Dates,_Walnuts,_and_Oats 0.679131670 1.43917651 -0.1453172
## Fruitful_Bran
                                          1.135892793 1.29715251 -0.1453172
## Grape_Nuts_Flakes
                                         -0.462771138 -0.19409946 -0.1453172
                                         -0.919532261 -0.12308746 -0.1453172
## Grape-Nuts
## Great_Grains_Pecan
                                         -0.691151699 0.01893653 -0.1453172
## Just_Right_Crunchy__Nuggets
                                         -0.234390576 -0.54915946 3.2115106
## Just_Right_Fruit_&_Nut
                                          0.450751108 -0.05207547 3.2115106
                                         -0.919532261 -0.83320745 -0.1453172
## Kix
## Life
                                         -0.234390576 -0.05207547 -0.1453172
## Maypo
                                         -0.919532261 -0.05207547 -0.1453172
## Muesli_Raisins,_Dates,_&_Almonds
                                          0.907512232 1.01310452 -0.1453172
## Muesli_Raisins,_Peaches,_&_Pecans
                                          0.907512232 1.01310452 -0.1453172
## Mueslix_Crispy_Blend
                                          1.364273355 0.87108052 -0.1453172
## Nutri-Grain_Almond-Raisin
                                         ## Nutri-grain Wheat
                                         -1.147912823 -0.12308746 -0.1453172
## Oatmeal_Raisin_Crisp
                                          0.679131670 0.30298453 -0.1453172
##
                                              shelf
                                                        weight
                                                                      cups
## 100%_Natural_Bran
                                          0.9515734 -0.1967771 0.76901001
## Basic_4
                                          0.9515734 1.9962520 -0.30526014
## Bran_Flakes
                                          0.9515734 -0.1967771 -0.64902659
## Cheerios
                                         -1.4507595 -0.1967771 1.84328015
## Clusters
                                          0.9515734 -0.1967771 -1.37953029
## Corn_Chex
                                         -1.4507595 -0.1967771 0.76901001
## Corn Flakes
                                         -1.4507595 -0.1967771 0.76901001
                                          0.9515734 -0.1967771 -1.37953029
## Cracklin'_Oat_Bran
## Crispix
                                          0.9515734 -0.1967771 0.76901001
## Crispy_Wheat_&_Raisins
                                          0.9515734 -0.1967771 -0.30526014
## Double_Chex
                                          0.9515734 -0.1967771 -0.30526014
                                         -0.2495930 -0.1967771 -0.09040611
## Frosted_Mini-Wheats
                                          0.9515734 1.4646086 -0.64902659
## Fruit_&_Fibre_Dates,_Walnuts,_and_Oats
## Fruitful_Bran
                                          0.9515734 1.9962520 -0.64902659
## Grape_Nuts_Flakes
                                          0.9515734 -0.1967771 0.25336034
## Grape-Nuts
                                          0.9515734 -0.1967771 -2.45380043
## Great_Grains_Pecan
                                          0.9515734 -0.1967771 -2.11003399
## Just_Right_Crunchy__Nuggets
                                          0.9515734 -0.1967771 0.76901001
## Just_Right_Fruit_&_Nut
                                          0.9515734 1.7968857 -0.30526014
## Kix
                                         -0.2495930 -0.1967771 2.91755030
## Life
                                         -0.2495930 -0.1967771 -0.64902659
                                         -0.2495930 -0.1967771 0.76901001
## Maypo
## Muesli_Raisins,_Dates,_&_Almonds
                                          0.9515734 -0.1967771 0.76901001
## Muesli_Raisins,_Peaches,_&_Pecans
                                          0.9515734 -0.1967771 0.76901001
## Mueslix_Crispy_Blend
                                          0.9515734 3.1259942 -0.64902659
## Nutri-Grain_Almond-Raisin
                                          0.9515734 1.9962520 -0.64902659
## Nutri-grain_Wheat
                                          0.9515734 -0.1967771 0.76901001
## Oatmeal_Raisin_Crisp
                                          0.9515734 1.4646086 -1.37953029
##
                                              rating cut_2
## 100%_Natural_Bran
                                         -0.61805706
```

```
2
## Basic 4
                                           -0.40058570
                                                           2
## Bran Flakes
                                            0.75801873
                                                           2
## Cheerios
                                            0.57657347
                                                           2
## Clusters
                                           -0.16127646
                                                           2
## Corn_Chex
                                           -0.08689833
                                                           2
## Corn_Flakes
                                            0.22763247
                                                           2
## Cracklin' Oat Bran
                                           -0.15781928
                                                           2
## Crispix
                                            0.30112138
                                                           2
## Crispy_Wheat_&_Raisins
                                           -0.46197591
                                                           2
## Double Chex
                                            0.11853896
                                                           2
## Frosted_Mini-Wheats
                                            1.11618949
## Fruit_&_Fibre_Dates,_Walnuts,_and_Oats -0.12448367
                                                           2
                                                           2
## Fruitful Bran
                                           -0.11747555
## Grape_Nuts_Flakes
                                            0.66996501
                                                           2
                                                           2
## Grape-Nuts
                                            0.76209027
                                                           2
## Great_Grains_Pecan
                                            0.22395859
## Just_Right_Crunchy__Nuggets
                                           -0.43723896
                                                           2
                                                           2
## Just Right Fruit & Nut
                                           -0.44095292
                                                           2
## Kix
                                           -0.24379018
## Life
                                            0.18952903
                                                           2
                                                           2
## Maypo
                                            0.86744227
## Muesli_Raisins,_Dates,_&_Almonds
                                                           2
                                           -0.39358784
## Muesli_Raisins,_Peaches,_&_Pecans
                                                           2
                                           -0.60694559
                                                           2
## Mueslix_Crispy_Blend
                                           -0.87934079
                                                           2
## Nutri-Grain_Almond-Raisin
                                           -0.14048156
## Nutri-grain_Wheat
                                            1.20857002
                                                           2
                                                           2
## Oatmeal Raisin Crisp
                                           -0.86955299
centroid 2 <- colMeans(result[result$cut 2==2,])</pre>
result[result$cut_2==3,]
##
                             calories
                                          protein
                                                          fat
                                                                  sodium
## Apple Cinnamon Cheerios
                            0.1599704 -0.4982277
                                                   0.98066557
                                                               0.2424445
## Apple Jacks
                            0.1599704 -0.4982277 -1.00647256 -0.4136273
## Bran_Chex
                            -0.8665066 -0.4982277 -0.01290349 0.4810160
## Cap'n'Crunch
                                                   0.98066557
                            0.6732089 -1.4116451
                                                               0.7195875
## Cinnamon_Toast_Crunch
                            0.6732089 -1.4116451
                                                   1.97423464 0.6003018
## Cocoa_Puffs
                            0.1599704 -1.4116451 -0.01290349 0.2424445
## Corn_Pops
                            0.1599704 -1.4116451 -1.00647256 -0.8311275
## Count_Chocula
                            0.1599704 -1.4116451 -0.01290349 0.2424445
## Froot_Loops
                            0.1599704 -0.4982277 -0.01290349 -0.4136273
## Frosted Flakes
                            0.1599704 -1.4116451 -1.00647256
                                                              0.4810160
                            0.1599704 -1.4116451 -0.01290349 -0.2943415
## Fruity_Pebbles
## Golden_Crisp
                           -0.3532681 -0.4982277 -1.00647256 -1.3679135
## Golden Grahams
                            0.1599704 -1.4116451 -0.01290349 1.4353022
## Honey_Graham_Ohs
                            0.6732089 -1.4116451 0.98066557
                                                               0.7195875
## Honey_Nut_Cheerios
                            0.1599704 0.4151897 -0.01290349 1.0774449
## Honey-comb
                            0.1599704 -1.4116451 -1.00647256 0.2424445
## Lucky_Charms
                            0.1599704 -0.4982277 -0.01290349
                                                               0.2424445
## Multi-Grain Cheerios -0.3532681 -0.4982277 -0.01290349 0.7195875
```

```
## Nut&Honey_Crunch
                         0.6732089 -0.4982277 -0.01290349 0.3617302
##
                              fiber
                                         carbo
                                                  sugars
                                                            potass
## Apple_Cinnamon_Cheerios -0.27354112 -1.10117049 0.6791317 -0.4071355
## Apple Jacks
                       -0.48332864 -0.97320572 1.5926539 -0.9752315
## Bran_Chex
                        ## Cap'n'Crunch
                        -0.90290366 -0.71727619 1.1358928 -0.9042195
## Cinnamon_Toast_Crunch -0.90290366 -0.46134666 0.4507511 -0.7621955
               -0.90290366 -0.71727619 1.3642734 -0.6201715
## Cocoa_Puffs
                       -0.48332864 -0.46134666 1.1358928 -1.1172554
## Corn_Pops
                     -0.90290366 -0.71727619 1.3642734 -0.4781475
## Count_Chocula
                       -0.48332864 -0.97320572 1.3642734 -0.9752315
## Froot_Loops
                     ## Frosted Flakes
## Fruity_Pebbles
## Golden_Crisp
## Golden_Grahams
## Honey_Graham_Ohs
## Honey_Nut_Cheerios -0.27354112 -0.84524095 0.6791317 -0.1230875
                       -0.90290366 -0.20541712 0.9075122 -0.9042195
## Honey-comb
                       -0.90290366 -0.71727619 1.1358928 -0.6201715
## Lucky_Charms
## Multi-Grain_Cheerios -0.06375361 0.05051241 -0.2343906 -0.1230875
## Nut&Honey_Crunch
                        -0.90290366 0.05051241 0.4507511 -0.8332075
##
                          vitamins
                                      shelf
                                               weight
                                                           cups
rating
## Apple_Cinnamon_Cheerios -0.1453172 -1.450759 -0.1967771 -0.3052601 -
0.9365625
## Apple_Jacks
                        -0.1453172 -0.249593 -0.1967771 0.7690100 -
0.6756899
                      -0.1453172 -1.450759 -0.1967771 -0.6490266
## Bran_Chex
0.4594871
                       -0.1453172 -0.249593 -0.1967771 -0.3052601 -
## Cap'n'Crunch
1.7528545
## Cinnamon_Toast_Crunch -0.1453172 -0.249593 -0.1967771 -0.3052601 -
1.6260883
## Cocoa Puffs
                       -0.1453172 -0.249593 -0.1967771 0.7690100 -
1.4187264
                       -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Corn Pops
0.4899817
                   -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Count_Chocula
1.4429256
                       -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Froot_Loops
0.7444941
## Frosted_Flakes
                   -0.1453172 -1.450759 -0.1967771 -0.3052601 -
0.7994234
                       -0.1453172 -0.249593 -0.1967771 -0.3052601 -
## Fruity_Pebbles
1.0421897
## Golden_Crisp
                    -0.1453172 -1.450759 -0.1967771 0.2533603 -
0.5277361
                       -0.1453172 -0.249593 -0.1967771 -0.3052601 -
## Golden Grahams
1.3427262
## Honey_Graham_Ohs -0.1453172 -0.249593 -0.1967771 0.7690100 -
```

```
1.4803151
                            -0.1453172 -1.450759 -0.1967771 -0.3052601 -
## Honey Nut Cheerios
0.8253186
## Honey-comb
                            -0.1453172 -1.450759 -0.1967771 2.1870466 -
0.9911728
                            -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Lucky_Charms
1.1341114
## Multi-Grain Cheerios
                           -0.1453172 -1.450759 -0.1967771 0.7690100 -
0.1822231
## Nut&Honey Crunch
                            -0.1453172 -0.249593 -0.1967771 -0.6490266 -
0.9070377
##
                            cut 2
## Apple Cinnamon Cheerios
                                3
## Apple Jacks
                                3
## Bran_Chex
                                3
                                3
## Cap'n'Crunch
                                3
## Cinnamon_Toast_Crunch
                                3
## Cocoa Puffs
## Corn_Pops
                                3
                                3
## Count Chocula
                                3
## Froot Loops
## Frosted_Flakes
                                3
## Fruity_Pebbles
                                3
## Golden Crisp
                                3
## Golden_Grahams
                                3
## Honey_Graham_Ohs
                                3
                                3
## Honey Nut Cheerios
## Honey-comb
                                3
## Lucky_Charms
                                3
## Multi-Grain Cheerios
                                3
## Nut&Honey_Crunch
                                3
centroid 3 <- colMeans(result[result$cut_2==3,])</pre>
result[result$cut 2==4,]
## [1] calories protein fat
                                              fiber
                                    sodium
                                                       carbo
                                                                 sugars
                                                                          potass
## [9] vitamins shelf
                           weight
                                    cups
                                              rating
                                                       cut 2
## <0 rows> (or 0-length row.names)
centroid_4 <- colMeans(result[result$cut_2==4,])</pre>
centroids <- rbind(centroid_1, centroid_2, centroid_3, centroid_4)</pre>
x2 <- as.data.frame(rbind(centroids[,-14], Partion_2))</pre>
#Calculating the Distance
Distance 1 <- get dist(x2)
Matrix 1 <- as.matrix(Distance 1)</pre>
dataframe1 <- data.frame(data=seq(1,nrow(Partion 2),1), Clusters =</pre>
rep(0,nrow(Partion 2)))
for(i in 1:nrow(Partion_2))
```

```
{dataframe1[i,2] <- which.min(Matrix_1[i+4, 1:4])}
dataframe1
      data Clusters
##
## 1
         1
                   2
         2
                   2
## 2
          3
                   3
## 3
## 4
          4
                   3
          5
                   2
## 5
## 6
         6
                   2
         7
                   2
## 7
## 8
         8
                   2
## 9
         9
                   3
                   3
## 10
        10
                   2
## 11
        11
## 12
        12
                   2
## 13
                   2
        13
## 14
        14
                   3
## 15
        15
                   2
## 16
                   2
        16
## 17
        17
                   2
## 18
                   2
        18
                   2
## 19
        19
## 20
        20
                   2
## 21
        21
                   3
## 22
        22
                   2
## 23
        23
                   2
## 24
        24
                   3
cbind(dataframe2$Cluster1[51:74], dataframe1$Clusters)
##
          [,1]
             2
##
    [1,]
    [2,]
             2
##
##
             3
   [3,]
             3
## [4,]
             2
##
    [5,]
             2
##
   [6,]
             2
##
    [7,]
             2
## [8,]
## [9,]
             3
## [10,]
             3
             2
## [11,]
## [12,]
             2
             2
## [13,]
## [14,]
             3
             2
## [15,]
## [16,]
             2
             2
## [17,]
             2
## [18,]
```

```
## [19,] 2
## [20,] 2
## [21,] 3
## [22,] 2
## [23,] 2
## [24,] 3

table(dataframe2$Cluster1[51:74] == dataframe1$Clusters)
##
```

#Hence we can say Model is partially stable. #Cluster 3 has highest stability in terms of cluster stability amongst all.

#Q4 Cluster with healthy Cereal and High nutrition value #The elementary public schools would like to choose a set of cereals to include in their daily cafeterias. Every day a different cereal is offered, but all cereals should support a healthy diet. For this goal, you are requested to find a cluster of "healthy cereals." Should the data be normalized? If not, how should they be used in the cluster analysis?

```
mydata <- na.omit(Assign_New)</pre>
rating <- cbind(mydata,cluster1)</pre>
rating[rating$clust==1,]
##
                                            calories
                                                        protein
## 100%_Bran
                                          -1.8929836 1.3286071 -0.01290349
## 100%_Natural Bran
                                           0.6732089 0.4151897 3.96137277
## All-Bran
                                          -1.8929836 1.3286071 -0.01290349
## All-Bran_with_Extra_Fiber
                                          -2.9194605 1.3286071 -1.00647256
## Basic 4
                                          1.1864474 0.4151897 0.98066557
## Clusters
                                          0.1599704 0.4151897 0.98066557
## Cracklin'_Oat_Bran
                                           0.1599704 0.4151897 1.97423464
## Crispy_Wheat & Raisins
                                          -0.3532681 -0.4982277 -0.01290349
## Fruit_&_Fibre_Dates,_Walnuts,_and_Oats
                                          0.6732089 0.4151897 0.98066557
## Fruitful_Bran
                                           0.6732089 0.4151897 -1.00647256
## Great Grains Pecan
                                           0.6732089 0.4151897 1.97423464
## Just_Right_Fruit_&_Nut
                                           1.6996859 0.4151897 -0.01290349
## Life
                                          -0.3532681 1.3286071 0.98066557
## Muesli_Raisins,_Dates,_&_Almonds
                                           2.2129244 1.3286071 1.97423464
## Muesli_Raisins,_Peaches,_&_Pecans
                                           2.2129244 1.3286071 1.97423464
## Mueslix_Crispy_Blend
                                          2.7261629 0.4151897 0.98066557
## Nutri-Grain Almond-Raisin
                                           1.6996859 0.4151897 0.98066557
## Oatmeal Raisin Crisp
                                          1.1864474 0.4151897 0.98066557
## Post_Nat._Raisin_Bran
                                           0.6732089 0.4151897 -0.01290349
                                          -0.3532681 1.3286071 -0.01290349
## Quaker Oat Squares
## Raisin_Bran
                                           0.6732089 0.4151897 -0.01290349
                                          -0.3532681 0.4151897 0.98066557
## Raisin_Nut_Bran
## Total_Raisin_Bran
                                          1.6996859 0.4151897 -0.01290349
##
                                                sodium
                                                             fiber
carbo
                                          -0.353984399 3.29284661 -
## 100% Bran
```

```
2.50878291
## 100%_Natural_Bran
                                      -1.725770770 -0.06375361 -
1.74099432
                                      1.196730628 2.87327158 -
## All-Bran
1.99692385
## All-Bran_with_Extra_Fiber
                                    -0.234698628 4.97114672 -
1.74099432
                                      0.600301771 -0.06375361
## Basic 4
0.81830100
## Clusters
                                      -0.234698628 -0.06375361 -
0.46134666
## Cracklin' Oat Bran
                                     1.22913525
## Crispy_Wheat_&_Raisins
                                    -0.234698628 -0.06375361 -
0.97320572
## Fruit & Fibre Dates, Walnuts, and Oats 0.003872915 1.19497147 -
0.71727619
                                      0.958159085 1.19497147 -
## Fruitful Bran
0.20541712
## Great_Grains_Pecan
                                     0.46134666
## Just_Right_Fruit_&_Nut
                                     0.123158686 -0.06375361
1.33016007
## Life
                                   -0.115412857 -0.06375361 -
0.71727619
## Muesli_Raisins,_Dates,_&_Almonds
                                    -0.771484599 0.35582142
0.30644194
## Muesli_Raisins,_Peaches,_&_Pecans -0.115412857 0.35582142
0.30644194
## Mueslix Crispy Blend
                                     -0.115412857 0.35582142
0.56237147
## Nutri-Grain_Almond-Raisin
                                     0.719587543 0.35582142
1.58608960
## Oatmeal_Raisin_Crisp
                                     0.123158686 -0.27354112 -
0.33338189
## Post Nat. Raisin Bran
                                      0.481016000 1.61454650 -
0.97320572
## Quaker_Oat_Squares
                                     -0.294341514 -0.06375361 -
0.20541712
                                      0.600301771 1.19497147 -
## Raisin Bran
0.20541712
                                      ## Raisin Nut Bran
1.10117049
                                      0.361730229 0.77539645
## Total_Raisin_Bran
0.05051241
##
                                           sugars
                                                      potass vitamins
                                     -0.234390576 2.57536849 -0.1453172
## 100%_Bran
## 100% Natural Bran
                                      -0.462771138 3.14346448 -0.1453172
## All-Bran
## All-Bran_with_Extra_Fiber
                                     -1.604673946 3.28548848 -0.1453172
```

```
## Basic 4
## Clusters
                                       -0.006010015 0.08994853 -0.1453172
## Cracklin'_Oat_Bran
                                       ## Crispy_Wheat_&_Raisins
                                        0.679131670 0.30298453 -0.1453172
## Fruit_&_Fibre_Dates,_Walnuts,_and_Oats
                                        0.679131670 1.43917651 -0.1453172
## Fruitful_Bran
                                        1.135892793 1.29715251 -0.1453172
## Great_Grains_Pecan
                                       -0.691151699 0.01893653 -0.1453172
                                        0.450751108 -0.05207547 3.2115106
## Just_Right_Fruit_&_Nut
## Life
                                       -0.234390576 -0.05207547 -0.1453172
## Muesli_Raisins,_Dates,_&_Almonds
                                        0.907512232
                                                    1.01310452 -0.1453172
                                        0.907512232 1.01310452 -0.1453172
## Muesli_Raisins,_Peaches,_&_Pecans
## Mueslix Crispy Blend
                                        1.364273355 0.87108052 -0.1453172
## Nutri-Grain_Almond-Raisin
                                       ## Oatmeal_Raisin_Crisp
                                        0.679131670 0.30298453 -0.1453172
## Post_Nat._Raisin_Bran
                                        1.592653916 2.29132050 -0.1453172
## Quaker_Oat_Squares
                                       ## Raisin_Bran
                                        1.135892793 2.00727250 -0.1453172
                                        ## Raisin Nut Bran
## Total_Raisin_Bran
                                        1.592653916 1.86524850 3.2115106
##
                                            shelf
                                                     weight
                                                                 cups
                                        0.9515734 -0.1967771 -2.1100340
## 100%_Bran
## 100%_Natural_Bran
                                        0.9515734 -0.1967771 0.7690100
## All-Bran
                                        0.9515734 -0.1967771 -2.1100340
## All-Bran_with_Extra_Fiber
                                        0.9515734 -0.1967771 -1.3795303
## Basic 4
                                        0.9515734 1.9962520 -0.3052601
## Clusters
                                        0.9515734 -0.1967771 -1.3795303
## Cracklin'_Oat_Bran
                                        0.9515734 -0.1967771 -1.3795303
## Crispy_Wheat_&_Raisins
                                        0.9515734 -0.1967771 -0.3052601
## Fruit_&_Fibre_Dates,_Walnuts,_and_Oats
                                        0.9515734 1.4646086 -0.6490266
## Fruitful Bran
                                        0.9515734 1.9962520 -0.6490266
## Great_Grains_Pecan
                                        0.9515734 -0.1967771 -2.1100340
## Just_Right_Fruit_&_Nut
                                        0.9515734 1.7968857 -0.3052601
## Life
                                       -0.2495930 -0.1967771 -0.6490266
## Muesli_Raisins,_Dates,_&_Almonds
                                        0.9515734 -0.1967771 0.7690100
## Muesli_Raisins,_Peaches,_&_Pecans
                                        0.9515734 -0.1967771 0.7690100
## Mueslix Crispy Blend
                                        0.9515734 3.1259942 -0.6490266
                                        0.9515734 1.9962520 -0.6490266
## Nutri-Grain_Almond-Raisin
## Oatmeal_Raisin_Crisp
                                        0.9515734 1.4646086 -1.3795303
## Post_Nat._Raisin_Bran
                                        0.9515734 1.9962520 -0.6490266
## Quaker_Oat_Squares
                                        0.9515734 -0.1967771 -1.3795303
## Raisin_Bran
                                       -0.2495930 1.9962520 -0.3052601
## Raisin_Nut_Bran
                                        0.9515734 -0.1967771 -1.3795303
## Total_Raisin_Bran
                                        0.9515734 3.1259942 0.7690100
##
                                           rating cluster1
## 100% Bran
                                        1.8321876
                                                        1
## 100%_Natural_Bran
                                                        1
                                       -0.6180571
## All-Bran
                                                        1
                                        1.1930986
## All-Bran_with_Extra_Fiber
                                                        1
                                        3.6333849
## Basic_4
                                       -0.4005857
                                                        1
## Clusters
                                       -0.1612765
```

```
## Cracklin'_Oat_Bran
                                                             1
                                           -0.1578193
                                                             1
## Crispy Wheat & Raisins
                                           -0.4619759
## Fruit_&_Fibre_Dates,_Walnuts,_and_Oats -0.1244837
                                                             1
                                                             1
## Fruitful Bran
                                           -0.1174756
## Great_Grains_Pecan
                                            0.2239586
                                                             1
                                                             1
## Just_Right_Fruit_&_Nut
                                           -0.4409529
## Life
                                                             1
                                           0.1895290
## Muesli_Raisins,_Dates,_&_Almonds
                                                             1
                                           -0.3935878
                                                             1
## Muesli_Raisins,_Peaches,_&_Pecans
                                           -0.6069456
## Mueslix Crispy Blend
                                                             1
                                           -0.8793408
## Nutri-Grain_Almond-Raisin
                                                             1
                                           -0.1404816
## Oatmeal_Raisin_Crisp
                                                             1
                                           -0.8695530
                                                             1
## Post Nat. Raisin Bran
                                           -0.3434906
## Quaker_Oat_Squares
                                           0.4873659
                                                             1
                                                             1
## Raisin_Bran
                                           -0.2425029
                                           -0.2108809
                                                             1
## Raisin_Nut_Bran
## Total_Raisin_Bran
                                           -1.0018246
                                                             1
rating[rating$clust==2,]
##
                             calories
                                                          fat
                                                                  sodium
                                          protein
## Apple Cinnamon Cheerios
                                                   0.98066557
                            0.1599704 -0.4982277
                                                               0.2424445
## Apple Jacks
                            0.1599704 -0.4982277 -1.00647256 -0.4136273
## Cap'n'Crunch
                            0.6732089 -1.4116451 0.98066557
                                                               0.7195875
## Cinnamon Toast Crunch
                            0.6732089 -1.4116451 1.97423464
                                                               0.6003018
## Cocoa_Puffs
                            0.1599704 -1.4116451 -0.01290349 0.2424445
## Corn Pops
                            0.1599704 -1.4116451 -1.00647256 -0.8311275
## Count Chocula
                            0.1599704 -1.4116451 -0.01290349 0.2424445
## Froot_Loops
                            0.1599704 -0.4982277 -0.01290349 -0.4136273
## Frosted_Flakes
                            0.1599704 -1.4116451 -1.00647256
                                                              0.4810160
## Fruity_Pebbles
                            0.1599704 -1.4116451 -0.01290349 -0.2943415
## Golden_Crisp
                           -0.3532681 -0.4982277 -1.00647256 -1.3679135
## Golden Grahams
                            0.1599704 -1.4116451 -0.01290349
                                                               1.4353022
## Honey Graham Ohs
                            0.6732089 -1.4116451 0.98066557
                                                               0.7195875
## Honey_Nut_Cheerios
                            0.1599704 0.4151897 -0.01290349 1.0774449
## Honey-comb
                            0.1599704 -1.4116451 -1.00647256 0.2424445
## Lucky_Charms
                            0.1599704 -0.4982277 -0.01290349 0.2424445
## Multi-Grain_Cheerios
                           -0.3532681 -0.4982277 -0.01290349 0.7195875
                            0.6732089 -0.4982277 -0.01290349 0.3617302
## Nut&Honey Crunch
## Smacks
                            0.1599704 -0.4982277 -0.01290349 -1.0696990
## Trix
                            0.1599704 -1.4116451 -0.01290349 -0.2346986
## Wheaties_Honey_Gold
                            0.1599704 -0.4982277 -0.01290349 0.4810160
##
                                 fiber
                                             carbo
                                                        sugars
                                                                   potass
## Apple_Cinnamon_Cheerios -0.27354112 -1.10117049
                                                     0.6791317 -0.4071355
## Apple Jacks
                           -0.48332864 -0.97320572 1.5926539 -0.9752315
## Cap'n'Crunch
                           -0.90290366 -0.71727619 1.1358928 -0.9042195
## Cinnamon_Toast_Crunch
                           -0.90290366 -0.46134666 0.4507511 -0.7621955
## Cocoa_Puffs
                           -0.90290366 -0.71727619 1.3642734 -0.6201715
                           -0.48332864 -0.46134666 1.1358928 -1.1172554
## Corn_Pops
## Count_Chocula
                           -0.90290366 -0.71727619 1.3642734 -0.4781475
```

```
## Froot Loops
                         -0.48332864 -0.97320572 1.3642734 -0.9752315
## Frosted_Flakes
                        -0.48332864 -0.20541712 0.9075122 -1.0462434
                         -0.90290366 -0.46134666 1.1358928 -1.0462434
## Fruity_Pebbles
                        -0.90290366 -0.97320572 1.8210345 -0.8332075
## Golden Crisp
                        -0.90290366 0.05051241 0.4507511 -0.7621955
## Golden_Grahams
## Honey_Graham_Ohs
                        -0.48332864 -0.71727619 0.9075122 -0.7621955
## Honey Nut Cheerios
                         -0.27354112 -0.84524095 0.6791317 -0.1230875
                         -0.90290366 -0.20541712 0.9075122 -0.9042195
## Honey-comb
## Lucky_Charms
                        -0.90290366 -0.71727619 1.1358928 -0.6201715
## Multi-Grain_Cheerios -0.06375361 0.05051241 -0.2343906 -0.1230875
## Nut&Honey_Crunch
                         -0.90290366 0.05051241 0.4507511 -0.8332075
## Smacks
                         -0.48332864 -1.48506478 1.8210345 -0.8332075
                         -0.90290366 -0.46134666 1.1358928 -1.0462434
## Trix
## Wheaties_Honey_Gold
                         ##
                           vitamins
                                       shelf
                                                weight
                                                            cups
rating
## Apple_Cinnamon_Cheerios -0.1453172 -1.450759 -0.1967771 -0.3052601 -
0.9365625
                -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Apple Jacks
0.6756899
                 -0.1453172 -0.249593 -0.1967771 -0.3052601 -
## Cap'n'Crunch
1.7528545
## Cinnamon_Toast_Crunch -0.1453172 -0.249593 -0.1967771 -0.3052601 -
1.6260883
                        -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Cocoa Puffs
1.4187264
                        -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Corn Pops
0.4899817
                    -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Count Chocula
1.4429256
                        -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Froot Loops
0.7444941
## Frosted_Flakes -0.1453172 -1.450759 -0.1967771 -0.3052601 -
0.7994234
## Fruity_Pebbles
                        -0.1453172 -0.249593 -0.1967771 -0.3052601 -
1.0421897
                    -0.1453172 -1.450759 -0.1967771 0.2533603 -
## Golden Crisp
0.5277361
                      -0.1453172 -0.249593 -0.1967771 -0.3052601 -
## Golden_Grahams
1.3427262
## Honey_Graham_Ohs -0.1453172 -0.249593 -0.1967771 0.7690100 -
1.4803151
## Honey_Nut_Cheerios -0.1453172 -1.450759 -0.1967771 -0.3052601 -
0.8253186
                        -0.1453172 -1.450759 -0.1967771 2.1870466 -
## Honey-comb
0.9911728
## Lucky_Charms
                -0.1453172 -0.249593 -0.1967771 0.7690100 -
1.1341114
## Multi-Grain_Cheerios -0.1453172 -1.450759 -0.1967771 0.7690100 -
0.1822231
```

```
## Nut&Honey Crunch
                     -0.1453172 -0.249593 -0.1967771 -0.6490266 -
0.9070377
                         -0.1453172 -0.249593 -0.1967771 -0.3052601 -
## Smacks
0.8140824
                         -0.1453172 -0.249593 -0.1967771 0.7690100 -
## Trix
1.0615859
## Wheaties Honey Gold
                          -0.1453172 -1.450759 -0.1967771 -0.3052601 -
0.4611670
##
                          cluster1
## Apple Cinnamon Cheerios
                                2
## Apple_Jacks
                                2
## Cap'n'Crunch
                                2
## Cinnamon Toast Crunch
                                2
## Cocoa_Puffs
                                2
## Corn_Pops
                                2
                                2
## Count Chocula
## Froot_Loops
                                2
                                2
## Frosted Flakes
                                2
## Fruity Pebbles
## Golden Crisp
                                2
## Golden Grahams
                                2
                                2
## Honey Graham Ohs
## Honey_Nut_Cheerios
                                2
## Honey-comb
                                2
                                2
## Lucky_Charms
## Multi-Grain_Cheerios
                                2
                                2
## Nut&Honey Crunch
## Smacks
                                2
## Trix
                                2
## Wheaties_Honey_Gold
                                2
rating[rating$clust==3,]
##
                               calories
                                           protein
                                                          fat
                                                                  sodium
                             -0.8665066 -0.4982277 -0.01290349
## Bran_Chex
                                                               0.4810160
## Bran Flakes
                             -0.8665066 0.4151897 -1.00647256
                                                               0.6003018
## Cheerios
                              0.1599704 3.1554419 0.98066557
                                                               1.5545879
## Corn_Chex
                              0.1599704 -0.4982277 -1.00647256 1.4353022
## Corn Flakes
                             -0.3532681 -0.4982277 -1.00647256 1.5545879
## Crispix
                              0.1599704 -0.4982277 -1.00647256 0.7195875
## Double Chex
                             -0.3532681 -0.4982277 -1.00647256
                                                               0.3617302
## Frosted Mini-Wheats
                             ## Grape_Nuts_Flakes
                             -0.3532681   0.4151897   -0.01290349   -0.2346986
## Grape-Nuts
                              ## Just_Right_Crunchy__Nuggets 0.1599704 -0.4982277 -0.01290349 0.1231587
## Kix
                              0.1599704 -0.4982277 -0.01290349 1.1967306
## Maypo
                              -0.3532681 1.3286071 -0.01290349 -1.9046994
## Nutri-grain Wheat
                              -0.8665066 0.4151897 -1.00647256 0.1231587
                              -0.3532681 0.4151897 -1.00647256 1.9124453
## Product 19
## Puffed Rice
                             -2.9194605 -1.4116451 -1.00647256 -1.9046994
```

```
## Puffed Wheat
                           -2.9194605 -0.4982277 -1.00647256 -1.9046994
## Raisin Squares
                           -0.8665066 -0.4982277 -1.00647256 -1.9046994
## Rice_Chex
                           0.1599704 -1.4116451 -1.00647256 0.9581591
## Rice Krispies
                           0.1599704 -0.4982277 -1.00647256 1.5545879
                           -1.3797451 -0.4982277 -1.00647256 -1.9046994
## Shredded_Wheat
## Shredded_Wheat_'n'Bran
                           -0.8665066   0.4151897   -1.00647256   -1.9046994
## Shredded Wheat spoon size
                           -0.8665066   0.4151897   -1.00647256   -1.9046994
## Special K
                           0.1599704 3.1554419 -1.00647256 0.8388733
## Strawberry_Fruit_Wheats
                           -0.8665066 -0.4982277 -1.00647256 -1.7257708
## Total Corn Flakes
                           0.1599704 -0.4982277 -0.01290349 0.4810160
## Total_Whole_Grain
                           -0.3532681 0.4151897 -0.01290349 0.4810160
## Triples
                           0.1599704 -0.4982277 -0.01290349 1.0774449
## Wheat Chex
                          -0.3532681 0.4151897 -0.01290349 0.8388733
## Wheaties
                           -0.3532681 0.4151897 -0.01290349 0.4810160
##
                                fiber
                                          carbo
                                                     sugars
potass
## Bran_Chex
                           0.77539645  0.05051241  -0.234390576
0.37399653
## Bran Flakes
                   1.19497147 -0.46134666 -0.462771138
1.29715251
## Cheerios
                          -0.06375361 0.56237147 -1.376293384
0.08994853
                          -0.90290366 1.84201913 -0.919532261 -
## Corn_Chex
1.04624345
                          -0.48332864 1.58608960 -1.147912823 -
## Corn Flakes
0.90421945
                          -0.48332864 1.58608960 -0.919532261 -
## Crispix
0.97523145
## Double Chex
                 0.26511146
## Frosted_Mini-Wheats
                          0.35582142 -0.20541712 -0.006010015
0.01893653
## Grape Nuts Flakes
                          0.19409946
                           ## Grape-Nuts
0.12308746
## Just_Right_Crunchy Nuggets -0.48332864 0.56237147 -0.234390576 -
0.54915946
                           -0.90290366 1.58608960 -0.919532261 -
## Kix
0.83320745
                          ## Maypo
0.05207547
## Nutri-grain_Wheat
                          0.12308746
## Product 19
                          -0.48332864 1.33016007 -0.919532261 -
0.76219545
## Puffed Rice
                      -0.90290366 -0.46134666 -1.604673946 -
1.18826745
## Puffed Wheat
                          -0.48332864 -1.22913525 -1.604673946 -
0.69118346
```

```
## Raisin Squares
                               -0.06375361 0.05051241 -0.234390576
0.16096053
## Rice Chex
                               -0.90290366 2.09794866 -1.147912823 -
0.97523145
                              -0.90290366 1.84201913 -0.919532261 -
## Rice_Krispies
0.90421945
## Shredded Wheat
                               0.05207547
## Shredded_Wheat_'n'Bran 0.77539645 1.07423054 -1.604673946
0.58703252
## Shredded_Wheat_spoon_size 0.35582142 1.33016007 -1.604673946
0.30298453
## Special K
                               0.62017146
## Strawberry_Fruit_Wheats 0.35582142 0.05051241 -0.462771138 -
0.12308746
## Total_Corn_Flakes
                               -0.90290366 1.58608960 -0.919532261 -
0.90421945
## Total Whole Grain 0.35582142 0.30644194 -0.919532261
0.16096053
## Triples
                              -0.90290366 1.58608960 -0.919532261 -
0.54915946
                               0.35582142 0.56237147 -0.919532261
## Wheat Chex
0.23197253
                               0.35582142 0.56237147 -0.919532261
## Wheaties
0.16096053
##
                            vitamins shelf weight cups
-0.1453172 -1.4507595 -0.1967771 -0.64902659
-0.1453172 0.9515734 -0.1967771 -0.64902659
-0.1453172 -1.4507595 -0.1967771 1.84328015
-0.1453172 -1.4507595 -0.1967771 0.76901001
-0.1453172 0.9515734 -0.1967771 0.76901001
                                vitamins
                                               shelf
                                                         weight
## Bran_Chex
## Bran Flakes
## Cheerios
## Corn Chex
## Corn_Flakes
## Crispix
## Double Chex
                              -0.1453172   0.9515734   -0.1967771   -0.30526014
## Frosted Mini-Wheats
                               -0.1453172 -0.2495930 -0.1967771 -0.09040611
## Grape_Nuts_Flakes
                               -0.1453172   0.9515734   -0.1967771   0.25336034
                               ## Grape-Nuts
## Just_Right_Crunchy__Nuggets 3.2115106 0.9515734 -0.1967771 0.76901001
## Kix
                               -0.1453172 -0.2495930 -0.1967771 2.91755030
## Maypo
                               -0.1453172 -0.2495930 -0.1967771 0.76901001
## Nutri-grain_Wheat
                               -0.1453172 0.9515734 -0.1967771 0.76901001
                                3.2115106 0.9515734 -0.1967771 0.76901001
## Product 19
## Puffed Rice
                               -1.2642598 0.9515734 -3.5195485 0.76901001
## Puffed_Wheat
                               -1.2642598 0.9515734 -3.5195485 0.76901001
## Raisin Squares
                               -0.1453172  0.9515734  -0.1967771  -1.37953029
## Rice Chex
                               -0.1453172 -1.4507595 -0.1967771 1.32763048
## Rice_Krispies
                               -0.1453172 -1.4507595 -0.1967771 0.76901001
## Shredded Wheat
                              -1.2642598 -1.4507595 -1.3265194 0.76901001
## Shredded_Wheat_'n'Bran
                               -1.2642598 -1.4507595 -0.1967771 -0.64902659
## Shredded_Wheat_spoon_size -1.2642598 -1.4507595 -0.1967771 -0.64902659
```

```
## Special K
                                -0.1453172 -1.4507595 -0.1967771 0.76901001
## Strawberry_Fruit_Wheats
                                -0.1453172 -0.2495930 -0.1967771 0.76901001
                                 3.2115106 0.9515734 -0.1967771 0.76901001
## Total_Corn_Flakes
## Total Whole Grain
                                 3.2115106 0.9515734 -0.1967771 0.76901001
## Triples
                                -0.1453172   0.9515734   -0.1967771   -0.30526014
## Wheat Chex
                                -0.1453172 -1.4507595 -0.1967771 -0.64902659
## Wheaties
                                -0.1453172 -1.4507595 -0.1967771 0.76901001
##
                                     rating cluster1
## Bran_Chex
                                0.45948710
## Bran Flakes
                                0.75801873
                                                   3
                                                   3
## Cheerios
                                0.57657347
                                                   3
## Corn Chex
                                -0.08689833
                                                   3
## Corn Flakes
                                0.22763247
                                                   3
## Crispix
                                0.30112138
## Double_Chex
                                                   3
                                0.11853896
                                                   3
## Frosted Mini-Wheats
                                1.11618949
## Grape_Nuts_Flakes
                                 0.66996501
                                                   3
                                                   3
## Grape-Nuts
                                 0.76209027
                                                   3
## Just_Right_Crunchy__Nuggets -0.43723896
## Kix
                                                   3
                                -0.24379018
                                                   3
## Maypo
                                0.86744227
                                                   3
## Nutri-grain_Wheat
                                1.20857002
## Product 19
                                                   3
                                -0.08273233
                                                   3
## Puffed Rice
                                1.28782197
                                                   3
## Puffed Wheat
                                1.44796198
                                                   3
## Raisin_Squares
                                0.90177096
                                                   3
## Rice Chex
                                -0.04746624
                                                   3
## Rice_Krispies
                                -0.14988985
## Shredded Wheat
                                                   3
                                1.82029290
## Shredded Wheat 'n'Bran
                                                   3
                                2.26429773
## Shredded_Wheat_spoon_size
                                                   3
                                2.14533086
                                                   3
## Special K
                                0.74502768
                                                   3
## Strawberry_Fruit_Wheats
                                1.18871964
                                                   3
## Total Corn Flakes
                                -0.27236281
                                                   3
## Total Whole Grain
                                 0.28426404
                                                   3
## Triples
                                -0.25339630
                                                   3
## Wheat Chex
                                 0.50698324
## Wheaties
                                0.63545985
                                                   3
```

#Mean ratings to determine the best cluster.

```
mean(rating[rating$cluster1==1,"rating"])
## [1] 0.01688218

mean(rating[rating$cluster1==2,"rating"])
## [1] -0.9836387

mean(rating[rating$cluster1==3,"rating"])
```

#### ## [1] 0.6239928

#As we can see that the mean ratings of the cluster3 is the highest, but as we are taking in consideration the word heathy diet which should include a cluster with healthy cereals I will choose cluster1 because of the following reason:

#Cluster 1 has high protein and fibre content compared to others. Hence, it can be said that cluster 1 possess high nutritional value and has healthy cereals

#Cluster 1 consists of fruits, nuts, wheat which can be considered as a healthy cereal.

#Data normalization is really important as we are using distance as a measure of performance.