Assignment-5

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```
setwd("C:/Users/krish/OneDrive/Desktop/R_MLCODES/rmullapu_64060")
library(readr)
library(tidyverse)
## -- Attaching packages ------ tidyverse
1.3.1 --
## v ggplot2 3.3.5 v dplyr 1.0.7
## v tibble 3.1.4 v stringr 1.4.0
## v tidyr 1.1.3
                      v forcats 0.5.1
## v purrr 0.3.4
## -- Conflicts ------
tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag() masks stats::lag()
library(cluster)
library(dplyr)
library(knitr)
library(caret)
## Loading required package: lattice
##
## Attaching package: 'caret'
## The following object is masked from 'package:purrr':
##
##
      lift
library(factoextra)
## Welcome! Want to learn more? See two factoextra-related books at
https://goo.gl/ve3WBa
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
cereals<- read.csv("Cereals.csv")</pre>
cereals
##
                                         name mfr type calories protein fat
sodium
## 1
                                    100%_Bran
                                                     C
                                                              70
                                                                       4
                                                Ν
                                                                           1
130
## 2
                            100%_Natural_Bran
                                                Q
                                                     C
                                                             120
                                                                       3
                                                                           5
15
                                                     C
## 3
                                     All-Bran
                                                Κ
                                                              70
                                                                       4
                                                                           1
260
                                                     C
## 4
                   All-Bran_with_Extra_Fiber
                                                              50
                                                                       4
                                                                           0
140
## 5
                               Almond Delight
                                                R
                                                     C
                                                             110
                                                                       2
                                                                           2
200
                     Apple_Cinnamon_Cheerios
## 6
                                                G
                                                     C
                                                             110
                                                                       2
                                                                           2
180
## 7
                                  Apple Jacks
                                                Κ
                                                     C
                                                             110
                                                                       2
                                                                           0
125
## 8
                                      Basic 4
                                                G
                                                     C
                                                             130
                                                                       3
                                                                           2
210
                                                                       2
## 9
                                    Bran Chex
                                                R
                                                     C
                                                              90
                                                                           1
200
                                                     C
## 10
                                  Bran Flakes
                                                              90
                                                                       3
                                                                           0
210
## 11
                                 Cap'n'Crunch
                                                     C
                                                                           2
                                                Q
                                                             120
                                                                       1
220
                                     Cheerios
                                                     C
                                                                           2
## 12
                                                G
                                                             110
                                                                       6
290
                       Cinnamon Toast Crunch
## 13
                                                     C
                                                             120
                                                                           3
                                                                       1
210
## 14
                                     Clusters
                                                G
                                                     C
                                                             110
                                                                       3
                                                                           2
140
```

## 15	Cocoa_Puffs	G	С	110	1	1	
180 ## 16	Corn_Chex	R	С	110	2	0	
280	Conn Flakes	V	C	100	า	0	
## 17 290	Corn_Flakes	K	С	100	2	0	
## 18	Corn_Pops	K	С	110	1	0	
90 ## 19	Count_Chocula	G	С	110	1	1	
180	_						
## 20 140	Cracklin'_Oat_Bran	K	С	110	3	3	
## 21	<pre>Cream_of_Wheat_(Quick)</pre>	N	Н	100	3	0	
80	Caianin	1/	_	110	2	0	
## 22 220	Crispix	K	С	110	2	0	
## 23	Crispy_Wheat_&_Raisins	G	С	100	2	1	
140 ## 24	Double_Chex	R	С	100	2	0	
190	boubic_chex	IX.	C	100		O	
## 25	Froot_Loops	K	С	110	2	1	
125 ## 26	Frosted_Flakes	K	С	110	1	0	
200	_						
## 27 0	Frosted_Mini-Wheats	K	С	100	3	0	
## 28	Fruit_&_Fibre_Dates,_Walnuts,_and_Oats	Р	С	120	3	2	
160 ## 29	Fruitful_Bran	K	С	120	3	0	
240	Traceat_brain	IX.	Č	120	,	Ū	
## 30	Fruity_Pebbles	Р	С	110	1	1	
135 ## 31	Golden_Crisp	Р	С	100	2	0	
45		_			_	_	
## 32 280	Golden_Grahams	G	С	110	1	1	
## 33	Grape_Nuts_Flakes	Р	С	100	3	1	
140 ## 34	Grape-Nuts	Р	С	110	3	0	
170	di ape Naes	•	Č	110	,	Ū	
## 35	Great_Grains_Pecan	Р	С	120	3	3	
75 ## 36	Honey_Graham_Ohs	Q	С	120	1	2	
220	· – –						
## 37 250	Honey_Nut_Cheerios	G	С	110	3	1	
## 38	Honey-comb	Р	С	110	1	0	
180 ## 39	Just_Right_CrunchyNuggets	K	С	110	2	1	
170	Just_Night_Crunchynuggets	K	C	110	۷	_	

## 40	Just_Right_Fruit_&_Nut	K	С	140	3	1	
170 ## 41	Kix	G	С	110	2	1	
260 ## 42	Life	Q	С	100	4	2	
150 ## 43	Lucky_Charms	G	С	110	2	1	
180 ## 44	Мауро	Α	Н	100	4	1	
0 ## 45	Muesli_Raisins,_Dates,_&_Almonds	R	С	150	4	3	
95 ## 46	Muesli_Raisins,_Peaches,_&_Pecans	R	С	150	4	3	
150 ## 47	Mueslix_Crispy_Blend	K	С	160	3	2	
150 ## 48	Multi-Grain_Cheerios	G	С	100	2	1	
220 ## 49	Nut&Honey_Crunch	K	С	120	2	1	
190 ## 50	Nutri-Grain_Almond-Raisin	K	С	140	3	2	
220 ## 51	Nutri-grain_Wheat	K	С	90	3	0	
170 ## 52	Oatmeal_Raisin_Crisp	G	С	130	3	2	
170 ## 53	Post_NatRaisin_Bran	Р	С	120	3	1	
200 ## 54	Product_19	K	С	100	3	0	
320 ## 55	Puffed_Rice	Q	С	50	1	0	
0 ## 56	Puffed_Wheat	Q	С	50	2	0	
0 ## 57	Quaker_Oat_Squares	Q	С	100	4	1	
135 ## 58 0	Quaker_Oatmeal	Q	Н	100	5	2	
## 59 210	Raisin_Bran	K	С	120	3	1	
## 60 140	Raisin_Nut_Bran	G	С	100	3	2	
## 61 0	Raisin_Squares	K	С	90	2	0	
## 62 240	Rice_Chex	R	С	110	1	0	
## 63 290	Rice_Krispies	K	С	110	2	0	
## 64 0	Shredded_Wheat	N	С	80	2	0	
U							

## 65 0			Shr	redded_W	heat_'n'B	ran	N	С		90	3	0
## 66			Shredo	ded_Whea	t_spoon_s	ize	N	С		90	3	0
0 ## 67					Sma	cks	K	С		110	2	1
70												
## 68 230					Specia	T_K	K	С		110	6	0
## 69			Stra	awberry_	Fruit_Whe	ats	N	С		90	2	0
15 ## 70				Total	_Corn_Fla	kes	G	С		110	2	1
200				Totol	Doisin D		_	6		140	2	1
## 71 190				iotai	_Raisin_B	ran	G	С		140	3	1
## 72				Total	_Whole_Gr	ain	G	С		100	3	1
200 ## 73					Trip	les	G	С		110	2	1
250 ## 74					т	rix	G	С		110	1	1
140					'	I.TX	u	C		110	1	1
## 75 230					Wheat_C	hex	R	С		100	3	1
## 76					Wheat	ies	G	С		100	3	1
200 ## 77				Whoatio	s_Honey_G	old.	G	С		110	2	1
200				wileacte	s_noney_d	oiu	G	C		110	2	1
##	fiber	carbo	sugars	notass	vitamins	shelf	WE	ight	cuns	rating		
## 1	10.0	5.0	6	280	25	3		_	-	68.40297		
## 2	2.0	8.0	8	135	0	3				33.98368		
## 3	9.0	7.0	5	320	25	3				59.42551		
## 4	14.0	8.0	0	330	25	3				93.70491		
## 5	1.0	14.0	8	NA	25	3				34.38484		
## 6	1.5	10.5	10	70	25	1				29.50954		
## 7	1.0	11.0	14	30	25	2				33.17409		
## 8	2.0	18.0	8	100	25	3				37.03856		
## 9	4.0	15.0	6	125	25	1				49.12025		
## 10	5.0	13.0	5	190	25	3				53.31381		
## 11	0.0	12.0	12	35	25	2				18.04285		
## 12	2.0	17.0	1	105	25	1				50.76500		
## 13	0.0	13.0	9	45	25	2				19.82357		
## 14	2.0	13.0	7	105	25	3				40.40021		
## 15	0.0	12.0	13	55	25	2				22.73645		
## 16	0.0	22.0	3	25	25	1				41.44502		
## 17	1.0	21.0	2	35	25	1				45.86332		
## 18	1.0	13.0	12	20	25	2				35.78279		
## 19	0.0	12.0	13	65	25	2				22.39651		
## 20	4.0	10.0	7	160	25	3				40.44877		
## 20	1.0	21.0	0	NA	0	2				64.53382		
## 21	1.0	21.0	3	30	25	3				46.89564		
## 22	2.0	11.0	10	120	25 25	3				36.17620		
11 T 23	2.0	±±.0	10	120	23	5		1.00	0.75	30.17020		

## 24	1.0	18.0	5	80	25	3	1.00 0.75 44.33086
## 25	1.0	11.0	13	30	25	2	1.00 1.00 32.20758
## 26	1.0	14.0	11	25	25	1	1.00 0.75 31.43597
## 27	3.0	14.0	7	100	25	2	1.00 0.80 58.34514
## 28	5.0	12.0	10	200	25	3	1.25 0.67 40.91705
## 29	5.0	14.0	12	190	25	3	1.33 0.67 41.01549
## 30	0.0	13.0	12	25	25	2	1.00 0.75 28.02576
## 31	0.0	11.0	15	40	25	1	1.00 0.88 35.25244
## 32	0.0	15.0	9	45	25	2	1.00 0.75 23.80404
## 33	3.0	15.0	5	85	25	3	1.00 0.88 52.07690
## 34	3.0	17.0	3	90	25	3	1.00 0.25 53.37101
## 35	3.0	13.0	4	100	25	3	1.00 0.33 45.81172
## 36	1.0	12.0	11	45	25	2	1.00 1.00 21.87129
## 37	1.5	11.5	10	90	25	1	1.00 0.75 31.07222
## 38	0.0	14.0	11	35	25	1	1.00 1.33 28.74241
## 39	1.0	17.0	6	60	100	3	1.00 1.00 36.52368
## 40	2.0	20.0	9	95	100	3	1.30 0.75 36.47151
## 41	0.0	21.0	3	40	25	2	1.00 1.50 39.24111
## 42	2.0	12.0	6	95	25	2	1.00 0.67 45.32807
## 43	0.0	12.0	12	55	25	2	1.00 1.00 26.73451
## 44	0.0	16.0	3	95	25	2	1.00 1.00 54.85092
## 45	3.0	16.0	11	170	25	3	1.00 1.00 37.13686
## 46	3.0	16.0	11	170	25	3	1.00 1.00 34.13976
## 47	3.0	17.0	13	160	25	3	1.50 0.67 30.31335
## 48	2.0	15.0	6	90	25	1	1.00 1.00 40.10596
## 49	0.0	15.0	9	40	25	2	1.00 0.67 29.92429
## 50	3.0	21.0	7	130	25	3	1.33 0.67 40.69232
## 51	3.0	18.0	2	90	25	3	1.00 1.00 59.64284
## 52	1.5	13.5	10	120	25	3	1.25 0.50 30.45084
## 53	6.0	11.0	14	260	25	3	1.33 0.67 37.84059
## 54	1.0	20.0	3	45	100	3	1.00 1.00 41.50354
## 55	0.0	13.0	0	15	0	3	0.50 1.00 60.75611
## 56	1.0	10.0	0	50	0	3	0.50 1.00 63.00565
## 57	2.0	14.0	6	110	25	3	1.00 0.50 49.51187
## 58	2.7	NA	NA	110	0	1	1.00 0.67 50.82839
## 59	5.0	14.0	12	240	25	2	1.33 0.75 39.25920
## 60	2.5	10.5	8	140	25	3	1.00 0.50 39.70340
## 61	2.0	15.0	6	110	25	3	1.00 0.50 55.33314
## 62	0.0	23.0	2	30	25	1	1.00 1.13 41.99893
## 63	0.0	22.0	3	35	25	1	1.00 1.00 40.56016
## 64	3.0	16.0	0	95	0	1	0.83 1.00 68.23588
## 65	4.0	19.0	0	140	0	1	1.00 0.67 74.47295
## 66	3.0	20.0	0	120	0	1	1.00 0.67 72.80179
## 67	1.0	9.0	15	40	25	2	1.00 0.75 31.23005
## 68	1.0	16.0	3	55	25	1	1.00 1.00 53.13132
## 69	3.0	15.0	5	90	25	2	1.00 1.00 59.36399
## 70	0.0	21.0	3	35	100	3	1.00 1.00 38.83975
## 71	4.0	15.0	14	230	100	3	1.50 1.00 28.59278
## 72	3.0	16.0	3	110	100	3	1.00 1.00 46.65884
## 73	0.0	21.0	3	60	25	3	1.00 0.75 39.10617

```
## 74
        0.0 13.0
                      12
                             25
                                      25
                                             2
                                                 1.00 1.00 27.75330
                                      25
## 75
                       3
                                             1
        3.0 17.0
                            115
                                                 1.00 0.67 49.78744
        3.0 17.0
                       3
                                      25
                                                 1.00 1.00 51.59219
## 76
                            110
                                             1
## 77
        1.0 16.0
                       8
                             60
                                      25
                                             1
                                                 1.00 0.75 36.18756
```

To view if the data has any missing values

#View(cereals)

To remove the missing values present in the data

```
cdata<- na.omit(cereals)
#view(cdata)</pre>
```

#QUESTION 1 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. # Normalize the data

```
cdata_norm <- cbind(cdata[, 1:3], scale(cdata[, -c(1:3)]))
#view(cdata_norm)</pre>
```

#Apply hierarchical clustering to the data using Euclidean distance

```
dist <- dist(cdata, method = "euclidean", diag = FALSE, upper = FALSE, p =2)
## Warning in dist(cdata, method = "euclidean", diag = FALSE, upper = FALSE,
: NAs
## introduced by coercion
#dist</pre>
```

#clustering the data and comparing them using agnes

```
single clust <- agnes(dist, method = "single")</pre>
print(single clust)
## Call:
             agnes(x = dist, method = "single")
## Agglomerative coefficient: 0.7311616
## Order of objects:
## [1] 1 4 2 27 44 61 69 64 65 66 55 56 6 19 15 43 38 49 26 11 13 36 77
24 14
## [26] 57 33 42 23 60 20 34 51 16 17 63 32 22 62 41 73 68 9 76 48 75 37 8
## [51] 7 25 30 74 18 31 67 46 47 28 12 45 10 29 53 59 35 39 70 40 72 71 54
3
## Height (summary):
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                              Max.
                                     48.28
##
      1.90
             20.64
                     28.69
                             36.13
                                            112.44
##
## Available components:
```

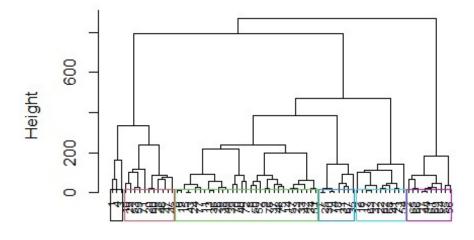
```
"height" "ac"
## [1] "order"
                                           "merge"
                                                       "diss"
                                                                   "call"
## [7] "method"
                   "order.lab"
# the AGGLOMERATIVE COEFFICIENT using single linkage method is 0.7311616
complete_clust <- agnes(dist, method = "complete")</pre>
print(complete clust)
## Call:
             agnes(x = dist, method = "complete")
## Agglomerative coefficient: 0.922957
## Order of objects:
## [1] 1 4 3 10 29 53 59 71 20 60 28 45 46 47 2 65 66 27 44 61 69 64 18
31 67
## [26] 35 55 56 6 19 15 43 77 11 13 36 26 38 49 7 25 30 74 8 50 52 9 76
## [51] 51 14 57 23 33 42 39 70 40 72 12 37 48 75 16 17 63 32 22 62 68 41 73
54
## Height (summary):
##
      Min. 1st Qu. Median
                             Mean 3rd Qu.
                                              Max.
##
      1.90
            22.32
                    43.77
                            70.53
                                     84.64 446.26
##
## Available components:
## [1] "order"
                   "height"
                               "ac"
                                           "merge"
                                                       "diss"
                                                                   "call"
                   "order.lab"
## [7] "method"
#using complete linkage method the AGGLOMERATIVE COEFFICIENT is 0.922957
avg_clust <- agnes(dist, method = "average")</pre>
print(avg clust)
## Call:
             agnes(x = dist, method = "average")
## Agglomerative coefficient: 0.8792621
## Order of objects:
## [1] 1 4 3 2 27 44 61 69 64 65 66 35 55 56 6 19 15 43 77 26 38 49 11
13 36
## [26] 14 57 23 33 42 24 34 51 52 8 50 9 76 48 75 12 37 16 17 63 32 22 62
## [51] 73 39 70 40 72 7 25 30 74 18 31 67 10 29 53 59 71 20 60 28 46 47 45
54
## Height (summary):
##
      Min. 1st Qu. Median
                             Mean 3rd Qu.
                                              Max.
##
      1.90
            22.32
                     37.90
                             54.82
                                     71.16 280.59
##
## Available components:
## [1] "order"
                   "height"
                               "ac"
                                           "merge"
                                                       "diss"
                                                                   "call"
## [7] "method"
                   "order.lab"
#using average linkage method the AGGLOMERATIVE COEFFICIENT is 0.8792621
ward_clust <- agnes(dist, method = "ward")</pre>
print(ward clust)
```

```
## Call: agnes(x = dist, method = "ward")
## Agglomerative coefficient: 0.9597071
## Order of objects:
## [1] 1 4 3 10 29 53 59 71 20 60 28 46 47 45 6 19 15 43 24 77 11 13 36
26 38
## [26] 49 39 70 40 72 8 50 52 9 76 37 48 75 14 57 23 33 42 34 51 7 25 30
74 18
## [51] 31 67 35 12 16 17 63 32 22 62 68 41 73 54 2 65 66 27 44 61 69 64 55
## Height (summary):
##
     Min. 1st Qu. Median
                           Mean 3rd Qu.
                                            Max.
##
      1.90 22.89 44.72 96.14 91.98 869.24
##
## Available components:
## [1] "order"
                  "height"
                              "ac"
                                         "merge"
                                                     "diss"
                                                                 "call"
## [7] "method"
                  "order.lab"
#using ward linkage method the AGGLOMERATIVE COEFFICIENT is 0.9597071
```

by comparing the agglomerative coefficient values ward linkage method is the best method.

```
pltree(ward_clust, cex = 0.6, hang = -1)
rect.hclust(ward_clust, k = 6, border = 1:6)
```

Dendrogram of agnes(x = dist, method = "ward"



dist agnes (*, "ward")

```
Model_1 <- cutree(ward_clust, 6)
data <- cbind(data,Model_1)</pre>
```

QUESTION 3 cluster structure and stability

Cluster partition A

```
set.seed(123)
dataA index <- sample(seq_len(nrow(cdata_norm)), size = 67)</pre>
dataA <- cdata_norm[dataA_index,]</pre>
dataB <- cdata norm[-dataA index,]</pre>
dataA
##
                                          name mfr type
                                                            calories
                                                                        protein
## 33
                             Grape Nuts Flakes
                                                  Ρ
                                                       C
                                                         -0.3541153
                                                                      0.4522084
                                                  Ρ
## 53
                        Post_Nat._Raisin_Bran
                                                       C
                                                          0.6537514
                                                                      0.4522084
## 15
                                   Cocoa Puffs
                                                  G
                                                       C
                                                          0.1498180 -1.4068705
## 70
                             Total_Corn_Flakes
                                                  G
                                                       C
                                                          0.1498180 -0.4773310
## 44
                                                  Α
                                                       H -0.3541153
                                         Maypo
                                                                      1.3817478
                                                  G
## 52
                         Oatmeal Raisin Crisp
                                                       C
                                                          1.1576848
                                                                      0.4522084
## 45
            Muesli_Raisins,_Dates,_&_Almonds
                                                          2.1655516
                                                                      1.3817478
                                    Wheat Chex
## 75
                                                  R
                                                         -0.3541153
                                                                      0.4522084
                                                  K
## 27
                          Frosted Mini-Wheats
                                                       C -0.3541153
                                                                      0.4522084
## 60
                               Raisin_Nut_Bran
                                                  G
                                                       C -0.3541153
                                                                      0.4522084
                                                  Ρ
## 30
                                Fruity_Pebbles
                                                          0.1498180 -1.4068705
                                                  K
## 68
                                     Special_K
                                                          0.1498180
                                                                     3.2408266
                                   Bran Flakes
## 10
                                                  Р
                                                       C -0.8580487
                                                                      0.4522084
## 31
                                  Golden Crisp
                                                       C -0.3541153 -0.4773310
                           Honey_Nut_Cheerios
                                                  G
## 37
                                                          0.1498180
                                                                      0.4522084
## 9
                                     Bran Chex
                                                         -0.8580487 -0.4773310
                                                  Ρ
## 28 Fruit & Fibre Dates, Walnuts, and Oats
                                                          0.6537514
                                                                     0.4522084
                                                  G
## 8
                                       Basic 4
                                                       C
                                                          1.1576848
                                                                     0.4522084
## 73
                                       Triples
                                                  G
                                                       C
                                                          0.1498180 -0.4773310
                       Shredded Wheat 'n'Bran
## 65
                                                  N
                                                         -0.8580487
                                                                      0.4522084
## 20
                           Cracklin' Oat Bran
                                                  K
                                                          0.1498180
                                                                      0.4522084
## 38
                                    Honey-comb
                                                  Ρ
                                                       C
                                                          0.1498180 -1.4068705
                                                  G
## 74
                                          Trix
                                                         0.1498180 -1.4068705
                                                  K
## 18
                                     Corn Pops
                                                          0.1498180 -1.4068705
                                                  G
## 71
                             Total Raisin Bran
                                                         1.6616182
                                                                      0.4522084
                                                  G
                                                          0.1498180 -0.4773310
## 41
                                            Kix
## 13
                        Cinnamon Toast Crunch
                                                  G
                                                       C
                                                          0.6537514 -1.4068705
## 16
                                     Corn_Chex
                                                  R
                                                       C
                                                          0.1498180 -0.4773310
                                    Grape-Nuts
                                                  Ρ
                                                       C
## 34
                                                          0.1498180
                                                                      0.4522084
## 59
                                   Raisin Bran
                                                  K
                                                          0.6537514
                                                                     0.4522084
## 66
                    Shredded_Wheat_spoon_size
                                                  N
                                                       C -0.8580487
                                                                      0.4522084
                                                  Q
## 57
                           Quaker_Oat_Squares
                                                       C -0.3541153
                                                                      1.3817478
                                                  G
                                                       C
## 43
                                  Lucky_Charms
                                                          0.1498180 -0.4773310
                                  Cap'n'Crunch
## 11
                                                       C
                                                          0.6537514 -1.4068705
```

```
## 25
                                   Froot Loops
                                                       C
                                                          0.1498180 -0.4773310
                                                 Κ
## 29
                                 Fruitful Bran
                                                  K
                                                       C
                                                          0.6537514
                                                                     0.4522084
## 46
           Muesli_Raisins,_Peaches,_&_Pecans
                                                  R
                                                          2.1655516
                                                                      1.3817478
## 51
                            Nutri-grain Wheat
                                                  K
                                                         -0.8580487
                                                                      0.4522084
                                                 G
## 48
                         Multi-Grain_Cheerios
                                                         -0.3541153 -0.4773310
## 69
                      Strawberry_Fruit_Wheats
                                                 N
                                                         -0.8580487 -0.4773310
## 36
                             Honey Graham Ohs
                                                  Q
                                                          0.6537514 -1.4068705
                                                 N
## 64
                                Shredded Wheat
                                                         -1.3619821 -0.4773310
                                                  G
## 6
                      Apple_Cinnamon_Cheerios
                                                          0.1498180 -0.4773310
## 62
                                     Rice Chex
                                                  R
                                                          0.1498180 -1.4068705
                                                  K
## 50
                    Nutri-Grain Almond-Raisin
                                                       C
                                                          1.6616182
                                                                     0.4522084
                                                  G
## 14
                                      Clusters
                                                       C
                                                          0.1498180
                                                                     0.4522084
## 19
                                 Count Chocula
                                                  G
                                                          0.1498180
                                                                    -1.4068705
## 1
                                     100%_Bran
                                                 N
                                                         -1.8659155
                                                                     1.3817478
## 63
                                 Rice_Krispies
                                                 K
                                                       C
                                                          0.1498180
                                                                    -0.4773310
                                                 K
## 61
                               Raisin_Squares
                                                         -0.8580487 -0.4773310
## 7
                                   Apple_Jacks
                                                 K
                                                          0.1498180 -0.4773310
                                                  G
## 23
                       Crispy Wheat & Raisins
                                                         -0.3541153 -0.4773310
## 49
                             Nut&Honey Crunch
                                                 K
                                                          0.6537514 -0.4773310
## 72
                            Total Whole Grain
                                                  G
                                                         -0.3541153
                                                                     0.4522084
## 24
                                   Double Chex
                                                  R
                                                         -0.3541153 -0.4773310
                                   Corn_Flakes
## 17
                                                 K
                                                         -0.3541153 -0.4773310
## 26
                                Frosted_Flakes
                                                 K
                                                       C
                                                          0.1498180 -1.4068705
## 12
                                      Cheerios
                                                 G
                                                       C
                                                          0.1498180
                                                                      3.2408266
                                                  G
## 77
                          Wheaties Honey Gold
                                                          0.1498180
                                                                    -0.4773310
## 67
                                        Smacks
                                                 K
                                                          0.1498180
                                                                    -0.4773310
## 22
                                                 K
                                       Crispix
                                                          0.1498180
                                                                    -0.4773310
                       Just_Right_Fruit_&_Nut
                                                 K
                                                       C
## 40
                                                          1.6616182
                                                                     0.4522084
## 39
                  Just_Right_Crunchy__Nuggets
                                                 K
                                                       C
                                                          0.1498180 -0.4773310
                                                 K
## 54
                                    Product 19
                                                       C
                                                         -0.3541153
                                                                     0.4522084
## 2
                            100% Natural Bran
                                                  Q
                                                       C
                                                          0.6537514
                                                                     0.4522084
                                                  G
## 32
                                Golden_Grahams
                                                       C
                                                          0.1498180
                                                                    -1.4068705
## 47
                         Mueslix Crispy Blend
                                                  K
                                                       C
                                                          2.6694849
                                                                      0.4522084
##
             fat
                       sodium
                                     fiber
                                                  carbo
                                                             sugars
                                                                          potass
##
   33
       0.0000000
                  -0.27020566
                               0.34015322
                                            0.06944832 -0.48360961
                                                                    -0.19065695
   53
##
       0.0000000
                   0.45469653
                               1.57808790 -0.95838683
                                                         1.58103142
                                                                      2.27835060
## 15
       0.0000000
                   0.21306247 -0.89778146 -0.70142805
                                                         1.35162686 -0.61391539
                   0.45469653 -0.89778146
                                                       -0.94241873
## 70
       0.0000000
                                            1.61120105
                                                                    -0.89608768
## 44
       0.0000000
                 -1.96164410 -0.89778146
                                            0.32640711 -0.94241873
                                                                    -0.04957081
   52
                   0.09224544 -0.27881412 -0.31598986
                                                         0.66341318
##
       0.9932203
                                                                     0.30314456
## 45
                 -0.81388230
                               0.34015322
                                            0.32640711
                                                         0.89281774
                                                                      1.00857529
       1.9864405
   75
       0.0000000
                   0.81714763
                               0.34015322
                                            0.58336590 -0.94241873
                                                                      0.23260148
   27
      -0.9932203 -1.96164410
                               0.34015322 -0.18751047 -0.02480049
                                                                      0.02097226
       0.9932203
##
   60
                 -0.27020566
                               0.13383078 -1.08686623
                                                         0.20460407
                                                                      0.58531685
##
   30
                 -0.33061417 -0.89778146 -0.44446926
                                                         1.12222230
                                                                    -1.03717383
       0.0000000
                   0.81714763 -0.48513656
## 68 -0.9932203
                                            0.32640711 -0.94241873 -0.61391539
      -0.9932203
                   0.57551356
                               1.16544301 -0.44446926
                                                       -0.48360961
                                                                      1.29074758
##
   10
   31
      -0.9932203
                 -1.41796746 -0.89778146 -0.95838683
                                                         1.81043598
                                                                    -0.82554461
##
   37
       0.0000000
                  1.05878169 -0.27881412 -0.82990744
                                                         0.66341318
                                                                    -0.12011388
## 9
       0.0000000
                  0.45469653 0.75279812 0.06944832 -0.25420505
```

```
0.9932203 -0.02857160 1.16544301 -0.70142805
                                                     0.66341318
                                                                 1.43183372
## 8
       0.9932203
                  0.57551356 -0.07249167
                                         0.84032469
                                                      0.20460407
                                                                  0.02097226
   73
       0.0000000
                  1.05878169 -0.89778146
                                          1.61120105 -0.94241873 -0.54337232
##
   65 -0.9932203 -1.96164410
                             0.75279812
                                         1.09728348 -1.63063240
                                                                  0.58531685
                                                                  0.86748914
      1.9864405 -0.27020566 0.75279812 -1.21534562 -0.02480049
   38 -0.9932203
                  0.21306247 -0.89778146 -0.18751047
                                                      0.89281774 - 0.89608768
       0.0000000 -0.27020566 -0.89778146 -0.44446926
                                                     1.12222230 -1.03717383
   18 -0.9932203 -0.87429082 -0.48513656 -0.44446926
                                                      1.12222230 -1.10771690
                                         0.06944832
       0.0000000
                 0.33387950 0.75279812
                                                      1.58103142
                                                                 1.85509216
## 41
       0.0000000
                  1.17959872 -0.89778146
                                          1.61120105 -0.94241873 -0.82554461
## 13
       1.9864405
                  0.57551356 -0.89778146 -0.44446926
                                                      0.43400862 -0.75500154
   16 -0.9932203
                  1.42123279 -0.89778146
                                         1.86815984 -0.94241873 -1.03717383
   34 -0.9932203
                  0.09224544 0.34015322
                                         0.58336590 -0.94241873 -0.12011388
## 59
       0.0000000
                  0.57551356
                             1.16544301 -0.18751047
                                                      1.12222230
                                                                  1.99617831
## 66 -0.9932203 -1.96164410
                             0.34015322
                                         1.35424227 -1.63063240
                                                                  0.30314456
       0.0000000 -0.33061417 -0.07249167 -0.18751047 -0.25420505
                                                                  0.16205841
  43
       0.0000000
                 0.21306247 -0.89778146 -0.70142805
                                                      1.12222230 -0.61391539
                  0.69633060 -0.89778146 -0.70142805
  11
       0.9932203
                                                      1.12222230 -0.89608768
   25
       0.0000000 -0.45143121 -0.48513656 -0.95838683
                                                     1.35162686 -0.96663076
##
   29 -0.9932203
                  0.93796466
                             1.16544301 -0.18751047
                                                      1.12222230
                                                                  1.29074758
      1.9864405 -0.14938863
                             0.34015322
                                         0.32640711
                                                     0.89281774
                                                                  1.00857529
## 51 -0.9932203
                  0.09224544
                             0.34015322
                                          0.84032469 -1.17182329 -0.12011388
                  0.69633060 -0.07249167
                                          0.06944832 -0.25420505 -0.12011388
      0.0000000
## 69 -0.9932203 -1.78041856 0.34015322
                                          0.06944832 -0.48360961 -0.12011388
      0.9932203
                 0.69633060 -0.48513656 -0.70142805
                                                     0.89281774 -0.75500154
   64 -0.9932203 -1.96164410 0.34015322
                                         0.32640711 -1.63063240 -0.04957081
       0.9932203
                 0.21306247 -0.27881412 -1.08686623 0.66341318 -0.40228617
## 62 -0.9932203
                  0.93796466 -0.89778146
                                         2.12511863 -1.17182329 -0.96663076
       0.9932203
                  0.69633060 0.34015322
                                         1.61120105 -0.02480049
## 50
                                                                  0.44423070
       0.9932203 -0.27020566 -0.07249167 -0.44446926 -0.02480049
  14
                                                                  0.09151534
                 0.21306247 -0.89778146 -0.70142805
##
  19
       0.0000000
                                                      1.35162686 -0.47282925
       0.0000000 -0.39102269 3.22866747 -2.50013957 -0.25420505
                                                                  2.56052289
   63 -0.9932203
                 1.54204982 -0.89778146
                                         1.86815984 -0.94241873 -0.89608768
   61 -0.9932203 -1.96164410 -0.07249167
                                         0.06944832 -0.25420505
                                                                  0.16205841
      -0.9932203 -0.45143121 -0.48513656 -0.95838683
                                                      1.58103142 -0.96663076
       0.0000000 -0.27020566 -0.07249167 -0.95838683
                                                      0.66341318
   23
                                                                  0.30314456
                 0.33387950 -0.89778146
                                                     0.43400862 -0.82554461
## 49
       0.0000000
                                         0.06944832
       0.0000000
                  0.45469653 0.34015322
                                          0.32640711 -0.94241873
                                                                  0.16205841
## 72
  24 -0.9932203
                  0.33387950 -0.48513656
                                          0.84032469 -0.48360961 -0.26120003
  17 -0.9932203
                  1.54204982 -0.48513656
                                          1.61120105 -1.17182329 -0.89608768
##
  26 -0.9932203
                  0.45469653 -0.48513656 -0.18751047 0.89281774 -1.03717383
##
   12
       0.9932203
                  1.54204982 -0.07249167
                                          0.58336590 -1.40122785
                                                                 0.09151534
                                                      0.20460407 -0.54337232
## 77
       0.0000000
                  0.45469653 -0.48513656
                                          0.32640711
   67
                -1.11592488 -0.48513656 -1.47230441
##
       0.0000000
                                                      1.81043598 -0.82554461
  22 -0.9932203
                  0.69633060 -0.48513656
                                          1.61120105 -0.94241873 -0.96663076
## 40
       0.0000000
                  0.09224544 -0.07249167
                                          1.35424227 0.43400862 -0.04957081
## 39
       0.0000000
                  0.09224544 -0.48513656
                                          0.58336590 -0.25420505 -0.54337232
                                         1.35424227 -0.94241873 -0.75500154
   54 -0.9932203
                  1.90450091 -0.48513656
##
   2
       3.9728810 -1.78041856 -0.07249167 -1.72926320
                                                     0.20460407
                                                                  0.51477378
## 32 0.0000000 1.42123279 -0.89778146 0.06944832 0.43400862 -0.75500154
```

```
0.9932203 -0.14938863 0.34015322 0.58336590
                                                    1.35162686
                                                                 0.86748914
##
        vitamins
                      shelf
                               weight
                                             cups
                                                       rating
## 33 -0.1818422
                 0.9419715 -0.2008324
                                       0.24766475
                                                   0.69155685
                 0.9419715
                           1.9501886 -0.64324039 -0.32287913
## 53 -0.1818422
## 15 -0.1818422 -0.2598542 -0.2008324
                                      0.75675340 -1.39915514
## 70 3.1822385
                 0.9419715 -0.2008324
                                       0.75675340 -0.25168258
## 44 -0.1818422 -0.2598542 -0.2008324
                                       0.75675340 0.88922515
## 52 -0.1818422 0.9419715
                            1.4287290 -1.36444931 -0.84945049
## 45 -0.1818422 0.9419715 -0.2008324
                                      0.75675340 -0.37302488
## 75 -0.1818422 -1.4616799 -0.2008324 -0.64324039 0.52841741
## 27 -0.1818422 -0.2598542 -0.2008324 -0.09172768
                                                  1.13821301
## 60 -0.1818422 0.9419715 -0.2008324 -1.36444931 -0.19014120
## 30 -0.1818422 -0.2598542 -0.2008324 -0.30384795 -1.02225423
## 68 -0.1818422 -1.4616799 -0.2008324 0.75675340 0.76669214
## 10 -0.1818422 0.9419715 -0.2008324 -0.64324039
                                                   0.77969576
## 31 -0.1818422 -1.4616799 -0.2008324 0.24766475 -0.50730289
## 37 -0.1818422 -1.4616799 -0.2008324 -0.30384795 -0.80517325
## 9 -0.1818422 -1.4616799 -0.2008324 -0.64324039 0.48087533
## 28 -0.1818422 0.9419715 1.4287290 -0.64324039 -0.10366038
## 8 -0.1818422 0.9419715
                           1.9501886 -0.30384795 -0.38002951
## 73 -0.1818422 0.9419715 -0.2008324 -0.30384795 -0.23269772
## 65 -1.3032024 -1.4616799 -0.2008324 -0.64324039
                                                   2.28743193
## 20 -0.1818422 0.9419715 -0.2008324 -1.36444931 -0.13702824
## 38 -0.1818422 -1.4616799 -0.2008324 2.15674718 -0.97118798
## 74 -0.1818422 -0.2598542 -0.2008324
                                      0.75675340 -1.04166919
## 18 -0.1818422 -0.2598542 -0.2008324
                                      0.75675340 -0.46951197
## 71 3.1822385 0.9419715 3.0582904
                                       0.75675340 -0.98185009
## 41 -0.1818422 -0.2598542 -0.2008324
                                       2.87795610 -0.22308231
## 13 -0.1818422 -0.2598542 -0.2008324 -0.30384795 -1.60671768
## 16 -0.1818422 -1.4616799 -0.2008324 0.75675340 -0.06603869
## 34 -0.1818422 0.9419715 -0.2008324 -2.42505066 0.78377123
## 59 -0.1818422 -0.2598542 1.9501886 -0.30384795 -0.22179377
## 66 -1.3032024 -1.4616799 -0.2008324 -0.64324039
                                                   2.16834997
## 57 -0.1818422 0.9419715 -0.2008324 -1.36444931 0.50878106
## 43 -0.1818422 -0.2598542 -0.2008324 0.75675340 -1.11426481
## 11 -0.1818422 -0.2598542 -0.2008324 -0.30384795 -1.73360655
## 25 -0.1818422 -0.2598542 -0.2008324
                                      0.75675340 -0.72427057
## 29 -0.1818422 0.9419715 1.9501886 -0.64324039 -0.09664548
## 46 -0.1818422 0.9419715 -0.2008324
                                       0.75675340 -0.58658904
## 51 -0.1818422 0.9419715 -0.2008324
                                       0.75675340 1.23068291
## 48 -0.1818422 -1.4616799 -0.2008324
                                       0.75675340 -0.16145563
## 69 -0.1818422 -0.2598542 -0.2008324
                                       0.75675340 1.21081332
## 36 -0.1818422 -0.2598542 -0.2008324
                                       0.75675340 -1.46080340
## 64 -1.3032024 -1.4616799 -1.3089342
                                       0.75675340 1.84299757
## 6 -0.1818422 -1.4616799 -0.2008324 -0.30384795 -0.91652483
## 62 -0.1818422 -1.4616799 -0.2008324
                                      1.30826610 -0.02656845
## 50 -0.1818422 0.9419715 1.9501886 -0.64324039 -0.11967375
## 14 -0.1818422 0.9419715 -0.2008324 -1.36444931 -0.14048876
## 19 -0.1818422 -0.2598542 -0.2008324 0.75675340 -1.42337774
## 1 -0.1818422 0.9419715 -0.2008324 -2.08565823 1.85490376
```

```
## 63 -0.1818422 -1.4616799 -0.2008324
                                       0.75675340 -0.12909114
## 61 -0.1818422 0.9419715 -0.2008324 -1.36444931
                                                    0.92358705
     -0.1818422 -0.2598542 -0.2008324
                                        0.75675340 -0.65539984
## 23 -0.1818422 0.9419715 -0.2008324 -0.30384795 -0.44147911
## 49 -0.1818422 -0.2598542 -0.2008324 -0.64324039 -0.88697142
## 72 3.1822385
                 0.9419715 -0.2008324
                                        0.75675340
                                                    0.30548275
## 24 -0.1818422
                 0.9419715 -0.2008324 -0.30384795
                                                    0.13959735
## 17 -0.1818422 -1.4616799 -0.2008324
                                        0.75675340
                                                    0.24879639
## 26 -0.1818422 -1.4616799 -0.2008324 -0.30384795 -0.77925310
## 12 -0.1818422 -1.4616799 -0.2008324
                                        1.81735475
                                                    0.59807496
## 77 -0.1818422 -1.4616799 -0.2008324 -0.30384795 -0.44066942
## 67 -0.1818422 -0.2598542 -0.2008324 -0.30384795 -0.79392626
## 22 -0.1818422
                 0.9419715 -0.2008324
                                       0.75675340
                                                    0.32235640
## 40
      3.1822385
                 0.9419715 1.7546413 -0.30384795 -0.42043579
## 39
      3.1822385
                 0.9419715 -0.2008324
                                       0.75675340 -0.41671824
     3.1822385
                 0.9419715 -0.2008324
                                       0.75675340 -0.06186866
     -1.3032024
                 0.9419715 -0.2008324
                                       0.75675340 -0.59771126
## 32 -0.1818422 -0.2598542 -0.2008324 -0.30384795 -1.32308140
## 47 -0.1818422 0.9419715 3.0582904 -0.64324039 -0.85924775
```

#Use the cluster centroids from A to assign each record in partition B (each record is assigned to the cluster with the closest centroid).

```
dataA dist <- dist(dataA[, -c(1:3)], method = "euclidean")</pre>
hc_A <- hclust(dataA_dist, method = "ward.D")</pre>
Model_A <- cutree(hc_A, 6)</pre>
dataA <- cbind(Model_A, dataA)</pre>
head(dataA)
##
      Model A
                               name mfr type
                                               calories
                                                           protein
                                                                          fat
## 33
                                           C -0.3541153
            1
                  Grape Nuts Flakes
                                      Ρ
                                                         0.4522084 0.0000000
## 53
            2 Post_Nat._Raisin_Bran
                                      Ρ
                                           C
                                              0.6537514 0.4522084 0.0000000
## 15
            3
                        Cocoa_Puffs
                                      G
                                           C 0.1498180 -1.4068705 0.0000000
  70
            4
                  Total Corn Flakes
                                      G
                                              0.1498180 -0.4773310 0.0000000
##
                                           C
            5
## 44
                              Maypo
                                      Α
                                           H -0.3541153 1.3817478 0.0000000
## 52
            2
                                      G
                                              1.1576848
               Oatmeal_Raisin_Crisp
                                                         0.4522084 0.9932203
##
           sodium
                       fiber
                                   carbo
                                             sugars
                                                         potass
                                                                   vitamins
## 33 -0.27020566
                   0.3401532
                             0.06944832 -0.4836096 -0.19065695 -0.1818422
## 53
      0.45469653
                   1.5780879 -0.95838683
                                          1.5810314 2.27835060 -0.1818422
## 15
       0.21306247 -0.8977815 -0.70142805
                                          1.3516269 -0.61391539 -0.1818422
## 70
       0.45469653 -0.8977815
                              1.61120105 -0.9424187 -0.89608768
                                                                 3.1822385
## 44 -1.96164410 -0.8977815 0.32640711 -0.9424187 -0.04957081 -0.1818422
## 52
       0.09224544 -0.2788141 -0.31598986
                                          ##
           shelf
                     weight
                                  cups
                                           rating
       0.9419715 -0.2008324
## 33
                             0.2476647
                                        0.6915569
       0.9419715 1.9501886 -0.6432404 -0.3228791
## 53
## 15 -0.2598542 -0.2008324
                             0.7567534 -1.3991551
      0.9419715 -0.2008324
  70
                             0.7567534 -0.2516826
## 44 -0.2598542 -0.2008324
                             0.7567534 0.8892251
## 52
      0.9419715 1.4287290 -1.3644493 -0.8494505
```

```
C1 <- colMeans(dataA[dataA$Model A == 1,5:ncol(dataA)])</pre>
C2 <- colMeans(dataA[dataA$Model A == 2,5:ncol(dataA)])</pre>
C3 <- colMeans(dataA[dataA$Model_A == 3,5:ncol(dataA)])</pre>
C4 <- colMeans(dataA[dataA$Model A == 4,5:ncol(dataA)])
C5 <- colMeans(dataA[dataA$Model_A == 5,5:ncol(dataA)])</pre>
C6 <- colMeans(dataA[dataA$Model_A == 6,5:ncol(dataA)])</pre>
Centroids A <- rbind(C1, C2, C3, C4, C5, C6)
dist <- dist(rbind(Centroids_A, dataB[,4:ncol(dataB)]))</pre>
dist
##
                     C2
                               C3
                                        C4
                                                  C5
                                                           C6
                                                                      3
                                                                               4
            C1
## C2 3.087519
## C3 3.171116 3.766283
## C4 4.080860 4.394851 4.465807
## C5 3.120031 5.017983 4.225386 5.574752
## C6 3.992549 5.064938 3.600257 4.537638 4.243322
## 3 5.001063 6.043032 7.197863 7.486394 6.477277 7.838851
## 4 7.300259 8.670076 9.647012 9.528843 7.407964 9.662959 4.031051
## 35 2.937467 3.483268 4.492378 5.395800 4.485411 5.823893 5.940473 8.282237
## 42 2.116481 3.253686 3.177192 4.677708 3.523530 4.044877 5.449421 7.913299
## 55 5.871507 8.431790 6.391470 8.139591 4.910302 6.737769 8.695724 9.343676
## 56 5.617653 8.188194 6.445799 8.129250 4.710236 6.816139 7.916319 8.492807
## 76 3.013139 4.262622 3.278687 4.537729 3.020609 2.070710 6.290066 8.004134
##
            35
                     42
                               55
                                         56
## C2
## C3
## C4
## C5
## C6
## 3
## 4
## 35
## 42 2.768632
## 55 7.106645 6.462448
## 56 6.861611 6.052896 1.377717
## 76 4.732649 2.856300 6.290658 6.120699
```

#c. Assess how consistent the cluster assignments are compared to the assignments based on all the data.

```
Assignments<- data.frame(data[-dataA_index, "Model_1"])
Assignments$Model_A <- 0
Assignments[1,2] <-
which.max(c(2.462441,3.146983,3.782227,5.983747,4.881300,3.826735))
Assignments[2,2] <- which.max(c(2.312626,3.855177, 4.581339, 8.455727,4.827885,5.441721))
Assignments[3,2] <- which.max(c(3.437484, 1.869957, 4.404072, 8.395433,4.851045, 4.429787))
Assignments[4,2] <- which.max(c(3.339714, 1.285089,4.752289, 8.059830,4.687570, 3.657016))
```

```
Assignments [5,2] \leftarrow \text{which.max}(c(3.007575,3.930439,2.431885,6.230808,
5.027546, 4.008456))
Assignments [6,2] \leftarrow \text{which.max}(c(3.159701,4.694503,4.418982,6.075311,
4.930370, 3.901197))
Assignments [7,2] \leftarrow \text{which.max}(c(2.691188, 3.357138, 4.095313, 6.119492,
4.677708, 2.705759))
Assignments
##
     X3 X4 X35 X42 X55 X56 X76 Model A
## 1
     1
         4
              4
                   3
                       2
                            2
                                3
## 2 NA
          4
             NA
                 NA
                      NA
                           NA
                               NA
                                        NA
## 3 NA
         4
             NA
                 NA
                      NA
                           NA
                               NA
                                        NA
## 4 NA
         4
             NA
                 NA
                      NA
                           NA
                               NA
                                        NA
## 5 NA
         4
             NA
                 NA
                      NA
                           NA
                               NA
                                        NA
## 6 NA
         4
             NA
                 NA
                      NA
                           NA
                               NA
                                        NA
## 7 NA
        4
             NA
                 NA
                      NA
                          NA
                               NA
                                        NA
```

#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?

```
healthycereals <- cereals
healthycereals_na <- na.omit(healthycereals)</pre>
Clusthealthy <- cbind(healthycereals_na, Model_1)</pre>
Clusthealthy[Clusthealthy$Model 1==1,]
##
                            name mfr type calories protein fat sodium fiber
carbo
## 1
                       100%_Bran
                                    Ν
                                         C
                                                  70
                                                            4
                                                                1
                                                                      130
                                                                             10
5
## 3
                        All-Bran
                                    Κ
                                         C
                                                  70
                                                            4
                                                                      260
                                                                              9
7
                                         C
## 4 All-Bran with Extra Fiber
                                    Κ
                                                  50
                                                            4
                                                                0
                                                                      140
                                                                             14
8
##
     sugars potass vitamins shelf weight cups
                                                    rating Model 1
                280
                           25
                                   3
## 1
           6
                                          1 0.33 68.40297
                                                                  1
## 3
           5
                320
                           25
                                   3
                                          1 0.33 59.42551
                                                                  1
           0
                           25
                                   3
                                          1 0.50 93.70491
## 4
                330
                                                                  1
Clusthealthy[Clusthealthy$Model 1==2,]
##
                             name mfr type calories protein fat sodium fiber
carbo
               100%_Natural_Bran
## 2
                                     Q
                                          C
                                                  120
                                                             3
                                                                 5
                                                                        15
                                                                               2
8
## 27
             Frosted Mini-Wheats
                                     Κ
                                          C
                                                  100
                                                             3
                                                                                3
14
## 44
                            Maypo
                                          Н
                                                  100
                                                             4
                                                                 1
                                                                         0
                                                                                0
                                     Α
16
## 55
                     Puffed Rice
                                    Q
                                          C
                                                   50
                                                             1
                                                                 0
                                                                               0
```

13 ## 56			Puffed_Whe	at	Q	С		50	2	0	0	1
10			urreu_wiie	ac	Ų	C		50	2	Ü	U	_
## 61		Rai	isin_Squar	res	K	С		90	2	0	0	2
15												
## 64		Shr	redded_Whe	eat	N	C		80	2	0	0	3
16			_									
## 65	Shre	edded_Wh	neat_'n'Br	ran	N	C		90	3	0	0	4
19												
	Shredde	ed_Wheat	t_spoon_si	ize	N	С		90	3	0	0	3
20	C.t.	.1				6		00	_	_	4.5	2
## 69 15	Strav	wberry_i	Fruit_Whea	ats	N	С		90	2	0	15	3
##	cuanc	notacc	vitamins	cha]	£	weight	cuns	rating	Mode	1 1 د		
## 2	Sugar 3	135	VICAIIII113		3	_	_	33.98368	Houe	2		
## 27	7	100	25		2			58.34514		2		
## 44	3	95	25		2			54.85092		2		
## 55	0	15	0		3			60.75611		2		
## 56	0	50	0		3			63.00565		2		
## 61	6	110	25		3			55.33314		2		
## 64	0	95	0		1			68.23588		2		
## 65	0	140	0		1			74.47295		2		
## 66	0	120	0		1			72.80179		2		
## 69	5	90	25		2			59.36399		2		
02					_	_,,,	_,,,	52120222		_		
Clust	nealthy[[Clusthe	ealthy\$Mod	del_1	==	3,]						
	nealthy[[Clusthe	ealthy\$Mod	_		_	a cal	onies noc	toin	fa+	sodium	fihan
##	nealthy[[Clusthe	ealthy\$Mod	_		_	e calo	ories prot	tein	fat	sodium	fiber
## carbo			-	name	m	fr type		·				
## carbo ## 6			ealthy\$Mod	name	m	_		ories prot	tein 2	fat 2	sodium	fiber
## carbo ## 6 10.5			namon_Chee	name erios	m	fr type	-	110	2	2	180	1.5
## carbo ## 6 10.5 ## 8			namon_Chee	name	m	fr type	-	·				
## carbo ## 6 10.5 ## 8 18.0			namon_Chee Bas	name erios sic_4	m	fr type	2	110	2	2	180 210	1.5 2.0
## carbo ## 6 10.5 ## 8 18.0 ## 9			namon_Chee	name erios sic_4	m	fr type	2	110	2	2	180	1.5
## carbo ## 6 10.5 ## 8 18.0 ## 9			namon_Chee Bas Bran_	name erios sic_4 _Chex	m	fr type G G G G		110 130 90	2 3 2	2 2 1	180 210 200	1.5 2.0 4.0
## carbo ## 6 10.5 ## 8 18.0 ## 9			namon_Chee Bas	name erios sic_4 _Chex	m	fr type		110	2	2	180 210	1.5 2.0
## carbo ## 6 10.5 ## 8 18.0 ## 9 15.0 ## 11	Арр	ole_Cinr	namon_Chee Bas Bran_	name erios sic_4 _Chex runch	m m	fr type G G G G		110 130 90	2 3 2	2 2 1	180 210 200	1.5 2.0 4.0
## carbo ## 6 10.5 ## 8 18.0 ## 9 15.0 ## 11 12.0 ## 13	Арр	ole_Cinr	namon_Chee Bas Bran_ Cap'n'Cr	name erios sic_4 _Chex runch	m m	fr type G G G G R G		110 130 90 120	2 3 2 1	2 2 1 2	180 210 200 220	1.5 2.0 4.0 0.0
## carbo ## 6 10.5 ## 8 18.0 ## 9 15.0 ## 11 12.0	Арр	ole_Cinr	namon_Chee Bas Bran_ Cap'n'Cr n_Toast_Cr	name erios sic_4 _Chex runch	. m	fr type G G G G R G		110 130 90 120	2 3 2 1	2 2 1 2	180 210 200 220	1.5 2.0 4.0 0.0
## carbo ## 6 10.5 ## 8 18.0 ## 9 15.0 ## 11 12.0 ## 13 13.0	Арр	ole_Cinr	namon_Chee Bas Bran_ Cap'n'Cr n_Toast_Cr	name erios sic_4 _Chex runch	. m	fr type G G G Q G G G		110 130 90 120 120	2 3 2 1 1	2 2 1 2 3	180 210 200 220 210	1.5 2.0 4.0 0.0
## carbo ## 6 10.5 ## 8 18.0 ## 9 15.0 ## 11 12.0 ## 13 13.0 ## 14	Арр	ole_Cinr	namon_Chee Bas Bran_ Cap'n'Cr n_Toast_Cr	name erios sic_4 _Chex runch runch	m	fr type G G G Q G G G		110 130 90 120 120	2 3 2 1 1	2 2 1 2 3	180 210 200 220 210	1.5 2.0 4.0 0.0
## carbo ## 6 10.5 ## 8 18.0 ## 9 15.0 ## 11 12.0 ## 13 13.0 ## 14	Арр	ole_Cinr	namon_Chee Bas Bran_ Cap'n'Cr n_Toast_Cr Clus	name erios sic_4 _Chex runch runch	m	fr type G G G G G G G G		110 130 90 120 120 110	2 3 2 1 1 3	2 1 2 3	180 210 200 220 210 140	1.5 2.0 4.0 0.0 0.0 2.0
## carbo ## 6 10.5 ## 8 18.0 ## 11 12.0 ## 13 13.0 ## 14 13.0 ## 15 12.0 ## 19	Арр	ole_Cinr	namon_Chee Bas Bran_ Cap'n'Cr n_Toast_Cr Clus	name erios sic_4 _Chex runch runch sters	m	fr type G G G G G G G G		110 130 90 120 120 110	2 3 2 1 1 3	2 1 2 3	180 210 200 220 210 140	1.5 2.0 4.0 0.0 0.0 2.0
## carbo ## 6 10.5 ## 8 18.0 ## 11 12.0 ## 13 13.0 ## 14 13.0 ## 15 12.0 ## 19 12.0	Арр	ole_Cinr	namon_Chee Bas Bran_ Cap'n'Cr n_Toast_Cr Clus Cocoa_F Count_Cho	name erios sic_4 Chex runch runch sters Puffs	m	fr type G G G G G G G G		110 130 90 120 120 110 110	2 3 2 1 3 1	2 1 2 3 2 1	180 210 200 220 210 140 180 180	1.5 2.0 4.0 0.0 0.0 2.0 0.0
## carbo ## 6 10.5 ## 8 18.0 ## 15 12.0 ## 13 13.0 ## 14 13.0 ## 15 12.0 ## 19 12.0 ## 23	Арр	ole_Cinr	namon_Chee Bas Bran_ Cap'n'Cr n_Toast_Cr Clus Cocoa_F	name erios sic_4 Chex runch runch sters Puffs	m	fr type G G G G G G G G		110 130 90 120 120 110	2 3 2 1 1 3	2 1 2 3 2	180 210 200 220 210 140 180	1.5 2.0 4.0 0.0 0.0 2.0 0.0
## carbo ## 6 10.5 ## 8 18.0 ## 15 12.0 ## 13 13.0 ## 15 12.0 ## 19 12.0 ## 23 11.0	Арр	ole_Cinr	namon_Chee Bas Bran_ Cap'n'Cr n_Toast_Cr Clus Cocoa_F Count_Cho	name erios sic_4 _Chex runch runch sters Puffs ocula	m	fr type G G G G G G G G G G		110 130 90 120 120 110 110 110	2 3 2 1 1 3 1 1 2	2 1 2 3 2 1 1	180 210 200 220 210 140 180 180 140	1.5 2.0 4.0 0.0 0.0 2.0 0.0 2.0
## carbo ## 6 10.5 ## 8 18.0 ## 9 15.0 ## 11 12.0 ## 13 13.0 ## 15 12.0 ## 19 12.0 ## 23 11.0 ## 24	Арр	ole_Cinr	namon_Chee Bas Bran_ Cap'n'Cr n_Toast_Cr Clus Cocoa_F Count_Cho	name erios sic_4 _Chex runch runch sters Puffs ocula	m	fr type G G G G G G G G		110 130 90 120 120 110 110	2 3 2 1 3 1	2 1 2 3 2 1	180 210 200 220 210 140 180 180	1.5 2.0 4.0 0.0 0.0 2.0 0.0
## carbo ## 6 10.5 ## 8 18.0 ## 15 12.0 ## 13 13.0 ## 15 12.0 ## 19 12.0 ## 23 11.0	Арр	ole_Cinr Cinnamor	namon_Chee Bas Bran_ Cap'n'Cr n_Toast_Cr Clus Cocoa_F Count_Cho	name erios sic_4 Chex runch runch sters Ouffs ocula isins _Chex	m	fr type G G G G G G G G G G		110 130 90 120 120 110 110 110	2 3 2 1 1 3 1 1 2	2 1 2 3 2 1 1	180 210 200 220 210 140 180 180 140	1.5 2.0 4.0 0.0 0.0 2.0 0.0 2.0

14.0 ## 33	Gra	pe_Nuts_Flake	s	Р	С	100	3	1	140	3.0
15.0	5. 5	.po	-	·				_		
## 34		Grape-Nuts			С	110	3	0	170	3.0
17.0 ## 36	Шо	oney Graham Oh	_	Q	С	120	1	2	220	1.0
12.0	ПС	niey_dranaiii_on	3	Ų	C	120		2	220	1.0
## 37	Hone	y_Nut_Cheerio	S	G	С	110	3	1	250	1.5
11.5				_	_	440	á	_	400	
## 38 14.0		Honey-com	מו	Р	С	110	1	0	180	0.0
## 39	Just Right Cr	runchyNugget	S	K	С	110	2	1	170	1.0
17.0	_ 0 _	7 00								
## 40	Just_Rig	ght_Fruit_&_Nu	t	K	С	140	3	1	170	2.0
20.0		Lif		0	C	100	4	2	150	2 0
## 42 12.0		LIT	е	Q	С	100	4	2	130	2.0
## 43		Lucky_Charm	ıs	G	С	110	2	1	180	0.0
12.0										
## 48	Multi-	Grain_Cheerio	S	G	С	100	2	1	220	2.0
15.0 ## 49	Nic	ıt&Honey_Crunc	h	K	С	120	2	1	190	0.0
15.0	NU	readoney_crune	11	K	C	120	۷	_	190	0.0
## 50	Nutri-Grain	_Almond-Raisi	n	K	С	140	3	2	220	3.0
21.0										
## 51	Nut	ri-grain_Whea	t	K	С	90	3	0	170	3.0
18.0 ## 52	Oatmea	ıl_Raisin_Cris	n	G	С	130	3	2	170	1.5
13.5	ou emea	.1	Р	J		130		_	1,0	1.5
## 57	Quak	er_Oat_Square	s	Q	С	100	4	1	135	2.0
14.0					_	440	•	_		
## 70 21.0	Tot	:al_Corn_Flake	S	G	С	110	2	1	200	0.0
## 72	Tot	al Whole Grai	n	G	С	100	3	1	200	3.0
16.0										
## 75		Wheat_Che	X	R	С	100	3	1	230	3.0
17.0		l Un a a de dia	_	6	_	100	2		200	2 0
## 76 17.0		Wheatie	S	G	С	100	3	1	200	3.0
## 77	Wheat	:ies_Honey_Gol	d	G	С	110	2	1	200	1.0
16.0		,				-				
##	•	vitamins she		_	-	_	Model			
## 6	10 70		1			29.50954		3		
## 8 ## 9	8 100 6 125		3 1			37.03856 49.12025		3 3		
## 11	12 35		2			18.04285		3		
## 13	9 45		2			19.82357		3		
## 14	7 105	25	3	1.00	0.50	40.40021		3		
## 15	13 55		2			22.73645		3		
## 19	13 65	25	2	1.00	1.00	22.39651		3		

##	23	10	120	25	3	1.00 0.7	5 36.17620	3	
##	24	5	80	25	3	1.00 0.7	5 44.33086	3	
##	26	11	25	25	1	1.00 0.7	5 31.43597	3	
##	33	5	85	25	3	1.00 0.8	8 52.07690	3	
##	34	3	90	25	3	1.00 0.2	5 53.37101	3	
##	36	11	45	25	2	1.00 1.0	0 21.87129	3	
##	37	10	90	25	1	1.00 0.7	5 31.07222	3	
##	38	11	35	25	1	1.00 1.3	3 28.74241	3	
##	39	6	60	100	3	1.00 1.0	0 36.52368	3	
##	40	9	95	100	3	1.30 0.7	5 36.47151	3	
##	42	6	95	25	2	1.00 0.6	7 45.32807	3	
##	43	12	55	25	2	1.00 1.0	0 26.73451	3	
##	48	6	90	25	1	1.00 1.0	0 40.10596	3	
##	49	9	40	25	2	1.00 0.6	7 29.92429	3	
##	50	7	130	25	3	1.33 0.6	7 40.69232	3	
##	51	2	90	25	3	1.00 1.0	0 59.64284	3	
##	52	10	120	25	3	1.25 0.5	0 30.45084	3	
##	57	6	110	25	3	1.00 0.5	0 49.51187	3	
##	70	3	35	100	3	1.00 1.0	0 38.83975	3	
##	72	3	110	100	3	1.00 1.0	0 46.65884	3	
##	75	3	115	25	1	1.00 0.6	7 49.78744	3	
##	76	3	110	25	1	1.00 1.0	0 51.59219	3	
##	77	8	60	25	1	1.00 0.7	5 36.18756	3	

Clusthealthy[Clusthealthy\$Model_1==4,]

##		name	mfr	type	calories	proteir	n fat	sodium	fiber	carbo	
-	gars										
##	7	Apple_Jacks	K	C	110	2	2 0	125	1	11	
14											
##	18	Corn_Pops	K	C	110	1	L 0	90	1	13	
12											
##	25	Froot_Loops	K	C	110	2	2 1	125	1	11	
13											
##	30	Fruity_Pebbles	Р	C	110	1	L 1	135	0	13	
12											
##	31	Golden_Crisp	Р	C	100	2	2 0	45	0	11	
15											
##	35	<pre>Great_Grains_Pecan</pre>	Р	C	120	3	3	75	3	13	
4											
##	67	Smacks	K	С	110	2	2 1	70	1	9	
15											
##	74	Trix	G	C	110	1	L 1	140	0	13	
12											
##		potass vitamins she	elf v	veight	cups r	rating M	lode1_	_1			
##	7	30 25	2	1	1.00 33	.17409		4			
##	18	20 25	2	1	1.00 35	.78279		4			
##	25	30 25	2	1	1.00 32	. 20758		4			
##	30	25 25	2	1	0.75 28	.02576		4			
##	31	40 25	1	1	0.88 35	. 25244		4			

```
## 35
         100
                   25
                          3
                                 1 0.33 45.81172
## 67
                   25
                          2
                                 1 0.75 31.23005
                                                       4
          40
## 74
          25
                   25
                          2
                                 1 1.00 27.75330
                                                       4
mean(Clusthealthy[Clusthealthy$Model_1==1,"rating"])
## [1] 73.84446
mean(Clusthealthy[Clusthealthy$Model_1==2,"rating"])
## [1] 60.11492
mean(Clusthealthy[Clusthealthy$Model_1==3,"rating"])
## [1] 37.30956
mean(Clusthealthy[Clusthealthy$Model_1==4,"rating"])
## [1] 33.65472
```

hence we see that mean value of cluster 1 is high (73.84446), we can choose cluster1