session_22_segment___clusterings.R

- 2. Perform the below given activities:
- a. apply K-means clustering to identify similar recipes
- b. apply K-means clustering to identify similar attributes
- c. how many unique recipes that people order often
- d. what are their typical profiles

```
setwd("C:/Users/Seshan/Desktop/sv R related/acadgild/assignments/session 22")
library(readr)
epi_r <- read.csv("epi_r.csv")</pre>
View(epi_r)
df<-epi_r
df[df==""] <- NA
df1<-na.exclude(df)
View(df1)
str(df1)
library(factoextra)
library("factoextra")
df <- df1[1:1000, 1:6]
na.exclude(df)
View(df)
head(df[, 1:6])
# Prepare Data
df <- na.omit(df) # listwise deletion of missing</pre>
#df <- scale(df) # standardize variables
```

```
View(df)
set.seed(1234)
ind = sample(1:nrow(df),0.8*nrow(df),replace = F)
df_train =df[ind,-1]
df_{test} = df[-ind,-1]
summary(df)
dim(df)
# outlier definition
\# x > Q3+1.5*IQR - positive side outlier
\# x < Q1-1.5*IQR - negative or lower side outlier
par(mfrow=c(2,3))
(boxplot(df1$rating)$out);(boxplot(df1$calories)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)$out);(boxplot(df1$protein)
ot(df1$fat)$out);(boxplot(df1$sodium)$out)
apply(df,2,range)
apply(df,2,summary)
# KMeans - comes from Rcmdr library
# Kmeans- from amap library
# kmeans- from stats library
# steps in k-means clustering
#1- preprocessing the data (impute missing values, remove outliers, feature
trasnformation)
#2- scaling or standardization of data set
#3- decide the number of clusters (value of K)
#4- iterate over the samples to create clusters
#5- decide the distance measure
#6- calculate the group accuracy
# scaling of data
df_train1 <- scale(df_train)</pre>
head(df_train1)
```

```
class(df_train1)
# screeplot approach to decide the number of clusters
km = kmeans(df_train1,1)
km$withinss
km$tot.withinss
km = kmeans(df_train1,2)
km$withinss
km$tot.withinss
km = kmeans(df_train1,3)
km$withinss
km$tot.withinss
km = kmeans(df_train1,4)
km$withinss
km$tot.withinss
km = kmeans(df_train1,5)
km$withinss
km$tot.withinss
km = kmeans(df_train1,6)
km$withinss
km$tot.withinss
km = kmeans(df_train1,7)
km$withinss
km$tot.withinss
km = kmeans(df_train1,8)
km$withinss
km$tot.withinss
km = kmeans(df_train1,9)
km$withinss
```

```
km$tot.withinss
km = kmeans(df_train1,10)
km$withinss
km$tot.withinss
dev.off()
sumsq=NULL
for (i in 1:25)
sumsq[i] = sum(kmeans(df_train,centers=i, iter.max = 1000, nstart=i,
algorithm='Forgy')$withinss)
plot(1:25,sumsq,type='b', main='Screeplot showing within group sum of squares')
km = kmeans(df_train1,3)
km$withinss
km$tot.withinss
class(km$cluster)
summary(km)
km$centers
as.numeric(km$cluster)
length(km$cluster)
dim(df_train)
class(df_train)
df_train$cl <- km$cluster
head(df_train)
# profiles of clusters
aggregate(df_train[,1:5],list(df_train[,6]),mean)
table(df1$rating)
table(df1$calories)
table(df1$X22.minute.meals)
table(df1$sodium)
```

```
library(cluster)
clusplot(df_train,df_train$cl,cex=0.9,color=T,shade=T, labels=4,lines=0)
#HC clustering or Hierarchical Clustering
# distance (euclidean, manhattan, cosine distance)
# Divisive method (top down)
# Agglomorative method (bottom up)
df_train = df_train[,-5]
head(df_train)
str(df_train)
# compute the distance metrix
d1 <- dist(df_train,method='euclidean')</pre>
summary(d1)
# HC
fit <- hclust(d1,method = 'ward.D2')</pre>
plot(fit)
# single, double, average, ward, ward.D2
# agglomorative method
fit <- agnes(d1,metric='euclidean',method = 'ward')</pre>
plot(fit)
# divisive method
fit <- diana(d1,metric='euclidean')</pre>
plot(fit)
```

```
setwd("C:/Users/Seshan/Desktop/sv R related/acadgild/assignments/session 22")
library(readr)
epi_r <- read.csv("epi_r.csv")
#setwd("C:/Users/Seshan/Desktop/sv R related/acadgild/assignments/session 22")</pre>
```

```
#library(readr)
#epi r <- read.csv("C:/Users/Seshan/Desktop/sv R related/acadgild/assignments</pre>
/session22/epi_r.csv",header=T, na.strings=c("","NA"))
View(epi r)
df<-epi r
df[df==""] <- NA
df1<-na.exclude(df)</pre>
View(df1)
str(df1)
## 'data.frame':
                 15864 obs. of 680 variables:
                          : Factor w/ 17736 levels "'Wichcraft's Roasted
## $ title
Turkey, Avocado, Bacon, Onion Relish, & AÃ-oli on Ciabatta ",..: 8782 1738 11
861 15252 16218 8349 7499 17591 1005 1270 ...
                                2.5 4.38 3.75 3.12 4.38 ...
## $ rating
                          : num
## $ calories
                                426 403 165 547 948 170 602 256 766 174
                          : num
                                30 18 6 20 19 7 23 4 12 11 ...
##
   $ protein
                          : num
## $ fat
                                7 23 7 32 79 10 41 5 48 12 ...
                          : num
## $ sodium
                                559 1439 165 452 1042 ...
                            num
## $ X.cakeweek
                          : num
                                0000000000...
## $ X.wasteless
                            num
                                00000000000...
##
  $ X22.minute.meals
                                00000000000...
                         : num
## $ X3.ingredient.recipes
                          : num
                                00000000000...
## $ X30.days.of.groceries
                                0000000000...
                          : num
## $ advance.prep.required
                                00000000000...
                          : num
## $ alabama
                          : num
                                00000000000...
## $ alaska
                                00000000000...
                          : num
## $ alcoholic
                          : num
                                0000000000
## $ almond
                                00000000000...
                          : num
## $ amaretto
                          : num
                                00000000000...
## $ anchovy
                                00000000000...
                          : num
## $ anise
                          : num
                                00000000000...
##
  $ anniversary
                                0000000000...
                          : num
## $ anthony.bourdain
                          : num
                                0000000000...
## $ aperitif
                          : num
                                0000000000...
## $ appetizer
                                0000000000...
                          : num
## $ apple
                          : num
                                1000000000
## $ apple.juice
                          : num
                                0000000000...
## $ apricot
                                0000000000...
                          : num
## $ arizona
                                0000000000...
                          : num
## $ artichoke
                          : num
                                0000000000...
##
  $ arugula
                          : num
                                00000000000...
                                0000000000...
## $ asian.pear
                          : num
## $ asparagus
                          : num
                                00000000000...
## $ aspen
                          : num
                                0000000000...
## $ atlanta
                          : num
                                0000000000...
## $ australia
                                00000000000...
                        : num
```

```
##
   $ avocado
                                   00000000000...
                              num
##
   $ back.to.school
                                         0
                                           00000
                               num
##
   $ backyard.bbq
                                    0 0
                                         0
                                           00000
                               num
##
   $ bacon
                                         0
                                           1000
                                     0
                                       0
                               num
   $ bake
##
                               num
                                    0 1
                                       010000
                                                   1 0
##
   $ banana
                                         0
                                           0000
                               num
                                    0
                                     0
                                       0
                                                   1
##
   $ barley
                                    0 0
                                         0
                                           0
                                             000
                               num
   $ basil
##
                               num
                                    0 0
                                       0
                                         0
                                           1000
##
   $ bass
                                         0
                                           0000
                               num
##
   $ bastille.day
                                    0 1
                                       0
                                         0
                                           0
                                             0000
                               num
   $ bean
##
                                    1 0
                                       0
                                         0
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                                             000
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##
   $ beef
                               num
                                    0 0
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                                             100
   $ beef.rib
##
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                                       0
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                                           0
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                               num
##
   $ beef.shank
                             : num
                                    0 0
                                       0 0
                                           000000...
##
   $ beef.tenderloin
                                   0 0
                                       0 0
                                           00000
                               num
##
   $ beer
                                    0 0
                                       0 0
                                           0
                                             0 0 0
                               num
   $ beet
##
                               num
                                   0 0
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                                           00000
##
   $ bell.pepper
                                       0
                                         0
                                           0000
                               num
                                   0 0
##
   $ berry
                                       0
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                                           0
                                             0000
                               num
##
   $ beverly.hills
                             : num
                                    0 0
                                       0
                                         0
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                                             000
##
   $ birthday
                                   0 0
                                       0 0
                                           0000
                             : num
                                                   1 0
##
   $ biscuit
                                       00
                                           0000
                             : num
                                   0 0
##
   $ bitters
                                           000000
                             : num
                                   0 0
                                       0 0
##
   $ blackberry
                                   0 0
                                       0
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                                           00000
                               num
##
   $ blender
                             : num
                                    0 0
                                         0
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                                             0 0 0
##
   $ blue.cheese
                               num
                                    0 0
                                       0
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##
   $ blueberry
                                         0
                                           0000
                             : num
##
   $ boil
                             : num
                                           00000
                                    0 0
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##
   $ bok.choy
                                    0 0
                                       0
                                         0
                                             0 0 0
                             : num
                                           0
##
   $ bon.appA.tit
                             : num
                                   0 1
                                       0 1
                                           1001
                                                   1
##
   $ bon.appï..ï..tit
                                   0 0
                                       0 0
                                           0000
                               num
##
   $ boston
                                   0 0
                                       0 0
                                           0000
                             : num
   $ bourbon
##
                               num
                                    0 0
                                       0
                                         0
                                           0
                                             000
##
   $ braise
                                         0
                                             0 0 0
                               num
                                    0 0
                                           0
##
   $ bran
                               num
                                    0 0
                                       0
                                         0
                                           0
                                             0 0 0
##
   $ brandy
                                       0 0
                                           0000
                               num
##
   $ bread
                                       0 0
                                           0000
                               num
                                    0 0
                                                   0 0
##
   $ breadcrumbs
                                    0 0
                                       00000
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##
   $ breakfast
                                   0000000000
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##
   $ brie
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                               num
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##
   $ brine
                                         0
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                                             000
                               num
##
   $ brisket
                               num
                                    0 0
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                                             0000
##
   $ broccoli
                               num
                                    0 0
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##
   $ broccoli.rabe
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                               num
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##
   $ broil
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##
   $ brooklyn
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##
   $ brown.rice
                                   0 0
                                       0000000
                             : num
##
   $ brownie
                                       00000000
                             : num
                                   0 0
##
   $ brunch
                             : num
                                   0 0
                                       00000000
                                   0000000000
  $ brussel.sprout
                         : num
```

```
## $ buffalo
                                00000000000...
                           : num
## $ buffet
                                 00000000000...
                           : num
## $ bulgaria
                          : num
                                 0000000000...
## $ bulgur
                                00000000000...
                          : num
## $ burrito
                          : num
                                0000000000...
## $ butter
                          : num
                                0000000000...
## $ buttermilk
                                0000000000...
                          : num
## $ butternut.squash
                          : num
                                0000000000...
## $ butterscotch.caramel
                                0000000000...
                         : num
## $ cabbage
                                00000000000...
                          : num
## $ cake
                          : num 000000010...
## $ california
                          : num 0001000000...
## $ calvados
                          : num
                                0000000000...
## $ cambridge
                          : num 0000000000...
## $ campari
                          : num 0000000000...
##
   [list output truncated]
## - attr(*, "na.action")= 'exclude' Named int 4 7 8 12 22 23 24 31 32 35 .
. .
    ..- attr(*, "names")= chr "4" "7" "8" "12" ...
##
library(factoextra)
## Loading required package: ggplot2
## Welcome! Related Books: `Practical Guide To Cluster Analysis in R` at http
s://goo.gl/13EFCZ
library("factoextra")
df <- df1[1:1000, 1:6]
na.exclude(df)
##
title
## 1
                                                                Lenti
1, Apple, and Turkey Wrap
## 2
                                                     Boudin Blanc Terr
ine with Red Onion Confit
                                                                  Pot
ato and Fennel Soup Hodge
## 5
Spinach Noodle Casserole
## 6
The Best Blts
## 9
Korean Marinated Beef
## 10
                                         Ham Persillade with Mustard Pot
ato Salad and Mashed Peas
## 11
                                                   Yams Braised with C
ream, Rosemary and Nutmeg
```

## 13	Banana-Chocolate Chip Cake Wi
th Peanut Butter Frosting	
## 14	Beef Tenderlo
in with Garlic and Brandy	
## 15	
Peach Mustard	
## 16	
Raw Cream of Spinach Soup	Cura
## 17	Swee
t Buttermilk Spoon Breads ## 18	Cr
isp Braised Pork Shoulder	Ci
## 19	Mozzarella-Topped Peppers
with Tomatoes and Garlic	11022ai CIIa Toppea i eppei 3
	Asparagus, and New Potato Salad with Chive Vin
aigrette and Fried Capers	Asparagas, and New Focuco Salad With Childer Vin
## 21	Asian Pear and Watercress S
alad with Sesame Dressing	
## 25	
Sea Salt-Roasted Pecans	
## 26	
Garlic Baguette Crumbs	
## 27	
Cucumber-Basil Egg Salad	
## 28	
Dried Pear Crisps	
## 29	Green Bean, Red Onion, and Roast Potato Salad
with Rosemary Vinaigrette	
## 30	
Apricot-Cherry Shortcakes ## 33	Roasted Sweet-Potato Spea
rs with Bacon Vinaigrette	Noasted Sweet-Folato Spea
## 34	
Deviled Ham	
## 36	
Aztec Chicken	
## 38	
Sauteed Broccoli Rabe	
## 39	Grou
per with Tomato and Basil	
## 40	Bet
ter-Than-Pita Grill Bread	
## 41	Со
conut-Key Lime Sheet Cake	
## 42	Baked Halibut with Orzo, Spi
nach, and Cherry Tomatoes	
## 46	
Pickled Red Onions	c
## 47	S
picy Black Beans and Rice	

## 49								
Mexican Lime Soup								
## 50 rus Salad with Mint Su	ıgar	Cit						
## 51	.0	Mexica						
n Chile and Mushroom S	Soup							
## 52 nut Butter-Banana Mufi	inc			Pea				
## 54	1112			Pancetta Roast Chi				
cken with Walnut Stuff	ing			runceeta nouse eni				
## 55				197				
7 Coconut Angel Food (Cake			Vaal Burgans Stuff				
## 57 ed with Mozzarella Che	2626			Veal Burgers Stuff				
## 58								
Pumpkin Muffins								
## 59								
Orange Balsamic Glaze ## 60				Roasted Eggplant and Olive Spr				
ead with Pita Bread Ch	nips			Rouseed Eggptune and Office Spi				
## 61	•			P				
ecan Blue Cheese Crack								
## 62 Chinotle Cassan Dress		ne, (Grilled	Avocado, and Smoky Corn Salad with				
Chipotle-Caesar Dress: ## 63	_			Southwest Corn Bread Stuffing wi				
th Corn and Green Chil	lies			Colin Dommuâ\ 200\ 221c C				
## 64 orghum and Apple Stick	v Pudding			Colin Perryâ\200\231s S				
## 65	.,							
Mixed Berry Pavlovas								
## 67				Sca				
rborough Fair Tofu Bur ## 68	rger							
Italian Vinaigrette								
## 69				White Chocolate Tartlets with				
Strawberries and Banar	nas							
## 70				Tomato-Infused ## 1				
253 Preakness								
## rating calorie	s protein	fat	sodium					
## 1 2.500 42	•	7	559					
## 2 4.375 46		23	1439					
## 3 3.750 16	55 6	7	165					
## 5 3.125 54	17 20	32	452					
## 6 4.375 94	18 19	79	1042					
## 9 4.375 17		10	1272					
## 10 3.750 66		41	1696					
## 11 3.750 25		5	30					
## 13 4.375 76		48	439					
## 14 4.375 17	74 11	12	176					

##	15	3.125	134	4	3	1394
##	16	4.375	382	5	31	977
##	17	1.875	146	4	5	160
##	18	4.375	890	59	68	1027
##	19	5.000	107	5	7	344
	20	5.000	421	10	33	383
	21	4.375	345	11	19	423
##	25	3.750	279	3	30	206
	26	0.000	95	1	7	103
	27	3.750	215	6	20	250
	28	2.500	14	0	0	0
	29	4.375	351	6	19	79
	30	4.375	311	5	5	226
	33	4.375	376	7	18	604
	34	3.125	185	10	13	765
	36				44	
		3.750	625 107	39 4		1248
	38	4.375	107	4	10	329
	39	4.375	336	44	16	413
	40	2.500	145	3	6	208
	41	4.375	483	5	35	100
	42	4.375	634	44	31	181
	46	4.375	90	2	0	881
	47	3.750	202	19	8	815
	49	4.375	338	14	21	174
##	50	4.375	191	3	1	4
##	51	3.125	166	8	12	508
##	52	3.750	275	6	13	242
##	54	5.000	1203	89	87	583
##	55	3.750	266	4	7	148
	57	4.375	904	38	70	1413
	58	4.375	223	4	10	211
	59	3.750	194	2	3	697
	60	3.750	177	5	7	116
	61	3.750	70	2	6	60
	62	4.375	368	6	32	112
	63	5.000	293	7	15	565
	64			8	19	694
##	04	0.000	523	ð	19	094
	1187	3.125	224	6	17	120
	1188	3.750	244	7	21	236
	1190	4.375	199	3	9	14
##	1191	3.750	137	11	8	78
##	1193	5.000	195	1	3	15
##	1194	4.375	1311	81	85	1222
##	1196	4.375	326	6	11	336
	1197	4.375	111	2	8	170
	1199	4.375	507	20	27	957
	1200	4.375	625	42	30	1642
	1201	3.750	799	19	44	351
		2.7.50				JJ-

```
## 1202
          0.000
                      162
                                  2
                                      0
                                           2872
## 1203
                      766
                                 36
                                     43
                                           1330
          4.375
## 1204
                      177
          4.375
                                  3
                                     11
                                             12
## 1205
          5.000
                      396
                                 10
                                     24
                                            607
## 1206
                                      2
                                            255
          4.375
                      312
                                  6
## 1207
          4.375
                      510
                                 51
                                     20
                                            926
## 1209
                                     99
          3.750
                     1193
                                 43
                                           1384
## 1210
                      631
                                  9
                                     37
                                            307
          3.125
## 1211
                                  5
          3.750
                      651
                                     24
                                            249
## 1212
          4.375
                      611
                                 15
                                     34
                                            391
## 1214
                      598
                                  9
                                     37
                                            196
          4.375
## 1215
          3.125
                      300
                                 15
                                     15
                                             94
## 1216
                                     17
          4.375
                      261
                                  6
                                            173
## 1221
          3.750
                      135
                                  2
                                      5
                                             71
## 1222
          0.000
                      138
                                  0
                                      0
                                              2
## 1223
                       296
                                  9
                                     23
                                            283
          4.375
## 1224
          3.750
                      505
                                  6
                                     29
                                            216
## 1225
                       92
                                  7
                                      3
                                             39
          3.750
## 1226
                                  4
                                      9
                                            142
          4.375
                      126
## 1227
                                     10
          3.750
                      331
                                  8
                                             93
## 1228
          3.125
                      328
                                 38
                                     16
                                            555
## 1230
          2.500
                      378
                                 18
                                     31
                                            489
## 1232
          4.375
                                 53
                                     32
                                           1393
                      668
## 1233
          4.375
                      149
                                  9
                                      8
                                             49
## 1234
                      135
                                  1
                                      0
                                              1
          4.375
## 1235
          3.750
                      321
                                 12
                                     18
                                            537
## 1236
                                  9
                                     13
                                            213
          3.750
                      168
## 1237
          3.750
                      246
                                  2
                                      1
                                             17
## 1238
          4.375
                      380
                                  7
                                      6
                                            363
## 1239
                                     66
          4.375
                      831
                                 10
                                            212
## 1240
          4.375
                      563
                                 30
                                     42
                                           1414
## 1241
                                  5
                                     11
                                             27
          4.375
                      418
## 1242
          0.000
                      562
                                  1
                                      1
                                             46
## 1243
          3.750
                      507
                                 30
                                     38
                                            982
## 1245
                      351
                                 23
                                     24
          4.375
                                           1826
## 1246
                                     56
          4.375
                      880
                                 69
                                            250
## 1247
          5.000
                      639
                                 35
                                     28
                                           1155
## 1248
          3.750
                      457
                                 10
                                     24
                                            499
## 1249
          3.750
                      475
                                 21
                                     29
                                            510
## 1251
          5.000
                     1405
                                 17
                                     96
                                            597
## 1252
                                             10
          0.000
                       145
                                  0
                                      0
## 1253
                                  0
                                      0
                                              2
          0.000
                      136
View(df)
head(df[, 1:6])
##
                                                title rating calories protein fat
## 1
                   Lentil, Apple, and Turkey Wrap
                                                        2.500
                                                                     426
                                                                               30
                                                                                     7
## 2 Boudin Blanc Terrine with Red Onion Confit
                                                                     403
                                                                               18
                                                                                    23
                                                        4.375
                     Potato and Fennel Soup Hodge
                                                                                6
                                                        3.750
                                                                     165
                                                                                     7
```

```
## 5
                       Spinach Noodle Casserole
                                                              547
                                                                        20
                                                                            32
                                                   3.125
                                                                        19 79
## 6
                                   The Best Blts
                                                              948
                                                   4.375
                          Korean Marinated Beef
                                                              170
                                                                        7
                                                                            10
## 9
                                                   4.375
##
     sodium
## 1
        559
## 2
       1439
## 3
        165
        452
## 5
## 6
       1042
## 9
       1272
# Prepare Data
df <- na.omit(df) # listwise deletion of missing</pre>
#df <- scale(df) # standardize variables
View(df)
set.seed(1234)
ind = sample(1:nrow(df), 0.8*nrow(df), replace = F)
df train =df[ind,-1]
df_test = df[-ind, -1]
summary(df)
##
                              title
                                                            calories
                                             rating
## Pastry Dough
                                    4
                                         Min.
                                                :0.000
                                                         Min.
                                                               :
                                                                    2.0
   Chicken Stock
                                     3
                                         1st Qu.:3.750
                                                         1st Qu.: 177.0
    Balsamic Vinaigrette
                                     2
                                         Median :4.375
                                                         Median : 305.0
   Blackberry-Raspberry Sauce
                                    2
                                         Mean
                                                :3.812
                                                         Mean
                                                                : 449.1
   Blue Cheese Coleslaw
                                         3rd Qu.:4.375
                                                         3rd Qu.: 564.8
## Caramel Macadamia Nut Crunch :
                                    2
                                         Max.
                                                :5.000
                                                         Max.
                                                                 :8603.0
    (Other)
##
                                  :985
##
       protein
                          fat
                                           sodium
                            : 0.00
## Min.
         : 0.00
                     Min.
                                      Min.
                                             :
                                                   0.0
   1st Qu.: 3.00
                     1st Qu.: 7.00
                                      1st Qu.:
##
                                                  78.0
## Median : 7.00
                                                 242.0
                     Median : 17.00
                                      Median :
          : 18.21
                            : 25.91
##
   Mean
                     Mean
                                      Mean
                                                 759.5
    3rd Qu.: 23.00
                     3rd Ou.: 31.00
                                       3rd Ou.:
                                                 657.5
##
   Max.
          :470.00
                     Max.
                            :923.00
                                              :97225.0
                                      Max.
##
dim(df)
## [1] 1000
               6
# outlier definition
# x > Q3+1.5*IQR - positive side outlier
\# x < Q1-1.5*IQR - negative or lower side outlier
par(mfrow=c(2,3))
(boxplot(df1$rating)$out);(boxplot(df1$calories)$out);(boxplot(df1$protein)$o
ut);(boxplot(df1\$fat)\$out);(boxplot(df1\$sodium)\$out)
```

```
[1] 2.500 1.875 0.000 2.500 2.500 0.000 0.000 0.000 0.000 2.500 0.000
##
     [12] 0.000 2.500 0.000 0.000 0.000 0.000 0.000 0.000 2.500 0.000 0.000
##
     [23] 0.000 1.250 0.000 0.000 0.000 0.000 0.000 0.000 0.000 0.000 0.000
##
##
     [34] 0.000 2.500 0.000 0.000 0.000 0.000 2.500 0.000 0.000 2.500 0.000
##
     [45] 2.500 0.000 2.500 0.000 0.000 0.000 0.000 0.000 0.000 0.000 2.500
     [56] 2.500 2.500 1.250 2.500 0.000 0.000 2.500 1.250 2.500 0.000 0.000
##
##
     [67] 0.000 0.000 2.500 2.500 0.000 0.000 0.000 1.250 0.000 0.000 1.875
     [78] 0.000 0.000 2.500 1.250 2.500 0.000 0.000 0.000 0.000 2.500 0.000
##
     [89] 2.500 0.000 2.500 2.500 0.000 2.500 2.500 1.250 0.000 2.500 0.000
##
##
    [100] 0.000 0.000 0.000 0.000 2.500 0.000 0.000 0.000 2.500 0.000 0.000
    [111] 0.000 0.000 0.000 0.000 0.000 2.500 2.500 0.000 0.000 0.000 0.000
##
    [122] 0.000 0.000 0.000 0.000 0.000 0.000 0.000 0.000 0.000 0.000 0.000
##
##
    [133] 1.250 2.500 2.500 0.000 0.000 0.000 2.500 0.000 1.875 0.000 0.000
##
    [144] 0.000 0.000 1.875 0.000 0.000 0.000 0.000 0.000 1.250 0.000 0.000
    [155] 0.000 0.000 2.500 0.000 1.250 2.500 2.500 1.250 0.000 0.000 0.000
##
    [166] 2.500 2.500 2.500 2.500 0.000 0.000 0.000 0.000 1.250 2.500 0.000
##
    [177] 2.500 0.000 2.500 0.000 0.000 0.000 0.000 0.000 0.000 1.875 0.000
##
    [188] 0.000 0.000 0.000 0.000 0.000 1.875 0.000 0.000 1.250 0.000 1.250
    [199] 0.000 1.875 1.250 0.000 2.500 0.000 2.500 0.000 0.000 0.000 0.000
##
##
    [210] 0.000 0.000 0.000 0.000 2.500 0.000 0.000 0.000 0.000 0.000 0.000
##
    [221] 2.500 2.500 0.000 0.000 0.000 0.000 0.000 2.500 0.000 0.000 0.000
    [232] 0.000 0.000 2.500 0.000 0.000 0.000 0.000 0.000 0.000 0.000 0.000
##
    [243] 0.000 0.000 1.875 0.000 0.000 0.000 0.000 0.000 2.500 2.500 0.000
##
##
    [254] 2.500 0.000 2.500 0.000 2.500 0.000 0.000 0.000 0.000 0.000 0.000
    [265] 0.000 0.000 2.500 0.000 0.000 2.500 0.000 0.000 0.000 0.000 1.250
##
##
    [276] 0.000 2.500 0.000 0.000 0.000 2.500 0.000 0.000 0.000 1.875
    [287] 0.000 0.000 0.000 0.000 0.000 0.000 0.000 0.000 2.500 2.500 0.000
##
    [298] 2.500 2.500 0.000 2.500 2.500 0.000 1.875 2.500 2.500 0.000 0.000
##
    [309] 0.000 0.000 1.875 2.500 0.000 2.500 0.000 1.250 0.000 0.000 0.000
##
    [320] 0.000 0.000 0.000 0.000 0.000 0.000 0.000 2.500 0.000 0.000 2.500
    [331] 0.000 2.500 2.500 2.500 2.500 0.000 2.500 0.000 0.000 0.000 0.000
##
    [342] 0.000 0.000 2.500 0.000 2.500 0.000 1.875 0.000 1.875 0.000 0.000
##
##
    [353] 0.000 0.000 2.500 0.000 0.000 0.000 0.000 0.000 2.500 0.000 2.500
    [364] 0.000 0.000 0.000 2.500 0.000 0.000 0.000 2.500 0.000 1.250 2.500
    [375] 0.000 0.000 0.000 1.250 0.000 0.000 0.000 0.000 0.000 0.000 0.000
##
    [386] 2.500 0.000 0.000 0.000 0.000 1.250 0.000 2.500 0.000 0.000 1.250
##
    [397] 0.000 0.000 0.000 2.500 0.000 0.000 0.000 0.000 0.000 1.875 2.500
##
##
    [408] 0.000 0.000 0.000 2.500 2.500 0.000 0.000 0.000 1.250 0.000 2.500
    [419] 2.500 0.000 0.000 2.500 0.000 0.000 0.000 2.500 0.000 0.000 0.000
                                 2422
                                         16988
                                                            8187
##
    [722]
              5967
                       1669
                                                   2009
                                                                      2217
                                                            2075
##
    [729]
              3097
                       1945
                                 2267
                                          2529
                                                   4386
                                                                      3824
##
              1775
                       2505
                                 2881
                                         11349
                                                   2079
                                                            2492
                                                                      2421
    [736]
                                 1954
                                                            2783
                                                                      1959
##
    [743]
              1867
                       2276
                                          2013
                                                   1687
##
    [750]
              4000
                       2918
                                 2125
                                          7695
                                                   1811
                                                            3004
                                                                      1804
              2118
                                 2046
                                          1910
                                                            3926
                                                                      2556
##
    [757]
                       5265
                                                   1701
##
              4303
                       5638
                                66833
                                          2507
                                                   4595
                                                            2302
                                                                      4331
    [764]
                                 1689
                                                            2834
##
    [771]
              2714
                      15061
                                          2544
                                                   2885
                                                                      2177
    [778]
              3690
                                 2362
                                                   2721
                                                            2505
                                                                      1758
##
                       1727
                                         11846
```

	F-0-7								
##	[785]	1865	10635	3334	1693	1853	2817	2395	
##	[792]	1690	1885	4353	3613	9792	3204	8644	
##	[799]	15300	2013	3070	2183	1770	3657	1931	
##	[806]	1703	4121	2400	11628	1725	1992	2789	
##	[813]	1763	2092	2960	2116	5695	6052	2316	
##	[820]	1747	2762	2283	3593	8014	1916	7032	
##	[827]	1667	1888	9792	4770	1768	2008	2090	
##	[834]	1663	2303	2492	2493	1788	1676	2254	
##	[841]	1780	1749	2871	1821	5349	3443	4204	
##	[848]	2398	2007	1863	2388	2029	3604	2018	
##	[855]	2735	4186	2374	5638	2584	11451	2220	
##	[862]	1741	1957	2663	2357	7955	1792	2763	
##	[869]	1952	10042	2978	1926	4648	2434	1793	
##	[876]	45407	2831	5661	5263	1986	3614	1737	
##	[883]	5166	2702	4050	1713	3434	3340	2652	
##	[890]	13806	23273	2314	4603	1666	1809	1717	
##	[897]	4856	13447	1790	2920	1875	5197	2310	
##	[904]	2711	3684	2955	2420	2736	2858	3833	
##	[911]	34351	2938	2878	3603	1933	13820	4051	
##	[918]	15065	2873	4580	1995	2045	2953	1729	
##	[925]	1857	3175	1916	2734	3000	2112	2453	
##	[932]	4145	3167	2871	132025	3983	2335	2865	
##	[939]	3990	2078	11670	1795	2788	3773	2798	
##	[946]	16443	4584	3128	1957	9465	1871	3094	
##	[953]	2190	1846	1712	11428	2724	67253	8197	
##	[960]	2161	1937	2110	2106	1903	2152	3715	
##	[967]	1776	1772	2495	1705	2343	5915	2866	
##	[974]	22932	6677	2559	1751	2707	1759	1711	
##	[981]	1715	1872	2058	1775	2006	2121	2630	
##	[988]	2255	2293	1786	1933	3445	2509	15350	
##	[995]	2373	1951	1866	2715	2292	2434	1809	
##	[1002]	13430	4520	2853	2217	2883	1973	1690	
	[1009]	1918	1778	1951	3506	2053	2157	62368	
	[1016]	3636	1779	1706	3418	2369	1706	1716	
	[1023]	3588	2498	3169	1765	3648	1871	2345	
	[1030]	2830	2980	1814	3032	3022	2422	2377	
	[1037]	2426	2713	1868	2320	6927	7887	1926	
	[1044]	1742	2874	2410	1844	1844	1920	4029	
	[1051]	1709	1989	1749	3597	2248	1763	1916	
	[1058]	2030	1790	4927	2205	1719	1975	2018	
	[1065]	3771	2918	2000	2591	1865	1831	2751	
	[1072]	1870	3886	4819	1884	2495	2168	2497	
	[1079]	2337	2281	1676	2012	3065	5106	1825	
	[1086]	6267	2012	2183	2032	2149	3136	2039	
	[1093]	1738	2934	1717	2291	1695	2511	4382	
	[1100]	3711	4018	1672	3923	2861	3591	3777	
	[1107]	5980	1980	1959	1800	2064	9286	2811	
	[1114]	2579	2139	4830	3548	2509	1750	2528	
	[1121]	15416	2023	4240	2665	6046	2133	2206	
	[1128]	1828	1986	2446		12005810	1741	45240	
	[0]	_0_0					-/ '-	.52.10	

```
## [1135]
             2072
                      1940
                               2369
                                       2865
                                                2912
                                                         1747
                                                                 1904
                                       2805
                                                2340
## [1142]
             2725
                      1663
                               1737
                                                         3217
                                                                  3875
                                       2292
                                                         2027
## [1149]
             5753
                      3339
                               2745
                                                5684
                                                                 3698
apply(df,2,range)
       title
## [1,] "'Wichcraft's Roasted Turkey, Avocado, Bacon, Onion Relish, & AÃ<sup>-</sup>oli
on Ciabatta "
## [2,] "Zucchini with Vinegar and Mint "
       rating calories protein fat sodium
## [1,] "0.000" " 2"
                        " 0" " 0" "
                                "923" "97225"
## [2,] "5.000" "8603"
                        "470"
apply(df,2,summary)
##
         title
                     rating
                                calories
                                            protein
                                                        fat
                     "1000"
                                 "1000"
                                            "1000"
## Length "1000"
                                                        "1000"
## Class "character" "character" "character" "character"
         "character" "character" "character" "character" "character"
## Mode
##
         sodium
## Length "1000"
## Class "character"
## Mode
         "character"
# KMeans - comes from Rcmdr library
# Kmeans - from amap library
# kmeans- from stats library
# steps in k-means clustering
#1- preprocessing the data (impute missing values, remove outliers, feature t
rasnformation)
#2- scaling or standardization of data set
#3- decide the number of clusters (value of K)
#4- iterate over the samples to create clusters
#5- decide the distance measure
#6- calculate the group accuracy
# scaling of data
df train1 <- scale(df train)</pre>
head(df train1)
##
                      calories
                                 protein
                                                 fat
                                                          sodium
            rating
## 146 -0.07554974 -0.65481746 -0.5359008 -0.46718457 -0.17777045
## 785
       0.96651565 -0.38626336 -0.5040280 -0.26121760 -0.17753437
## 769
        0.44548296 -0.03097129 -0.3765369 -0.09644403 -0.18650555
## 1252 -3.20174592 -0.52471051 -0.5996463 -0.54957135 -0.19099114
## 1074 -0.59658244 0.49612868 1.1214833 0.19190972 0.02762239
```

```
class(df_train1)
## [1] "matrix"
# screeplot approach to decide the number of clusters
km = kmeans(df_train1,1)
km$withinss
## [1] 3995
km$tot.withinss
## [1] 3995
km = kmeans(df_train1,2)
km$withinss
## [1] 781.8523 2580.4197
km$tot.withinss
## [1] 3362.272
km = kmeans(df_train1,3)
km$withinss
## [1] 612.91771 39.87556 1797.64218
km$tot.withinss
## [1] 2450.435
km = kmeans(df_train1,4)
km$withinss
## [1] 39.87556 202.40093 1151.34612 405.29139
km$tot.withinss
## [1] 1798.914
km = kmeans(df_train1,5)
km$withinss
km$tot.withinss
## [1] 1180.936
km = kmeans(df_train1,6)
km$withinss
## [1] 438.01940 173.08807 121.65624 202.40093 102.13818 37.65537
```

```
km$tot.withinss
## [1] 1074.958
km = kmeans(df_train1,7)
km$withinss
## [1] 102.13818 202.40093 18.03701 37.65537 276.95475 140.32102 145.09666
km$tot.withinss
## [1] 922.6039
km = kmeans(df_train1,8)
km$withinss
## [1] 125.26434 37.65537 62.97005 141.34211 64.68009 102.13818 149.93891
## [8] 76.93294
km$tot.withinss
## [1] 760.922
km = kmeans(df_train1,9)
km$withinss
## [1] 102.13818 88.72301 141.34211 47.65000 56.04750 37.65537 90.78147
## [8] 68.16672 62.97005
km$tot.withinss
## [1] 695.4744
km = kmeans(df train1,10)
km$withinss
## [1] 48.03969 102.13818 141.34211 55.96067 41.80232 37.65537 67.54641
## [8] 42.58579 62.97005 53.27464
km$tot.withinss
## [1] 653.3152
dev.off()
## null device
##
             1
sumsq=NULL
for (i in 1:25)
  sumsq[i] = sum(kmeans(df_train,centers=i,
                        iter.max = 1000,
                        nstart=i,
                        algorithm='Forgy')$withinss)
```

```
plot(1:25,sumsq,type='b', main='Screeplot showing within group sum of squares
')
km = kmeans(df_train1,3)
km$withinss
## [1] 612.91771 39.87556 1797.64218
km$tot.withinss
## [1] 2450.435
class(km$cluster)
## [1] "integer"
summary(km)
##
         Length Class Mode
## cluster
         800
             -none- numeric
         15
## centers
             -none- numeric
## totss
         1
            -none- numeric
## withinss
         3
            -none- numeric
## tot.withinss 1 -none- numeric
## betweenss 1
            -none- numeric
## size
         3
            -none- numeric
## iter
          1
            -none- numeric
## ifault
         1 -none- numeric
km$centers
##
     rating calories
                 protein
                         fat
                               sodium
## 1 0.2462425 -0.1470263 -0.1454249 -0.1255707 -0.08042799
## 2 -3.0692800 -0.2659102 -0.3538479 -0.2144387 -0.11265136
## 3 0.2175312 2.4495400 2.5345094 2.0765074 1.29964639
as.numeric(km$cluster)
##
  1
2
```

```
length(km$cluster)
## [1] 800
dim(df train)
## [1] 800 5
class(df_train)
## [1] "data.frame"
df_train$cl <- km$cluster</pre>
head(df train)
##
 rating calories protein fat sodium cl
## 146
 3.750
   67
    2
     4
      66
       1
## 785
 5.000
   228
    3
     14
      67
       1
```

4.375

441

7 22

29 1

769

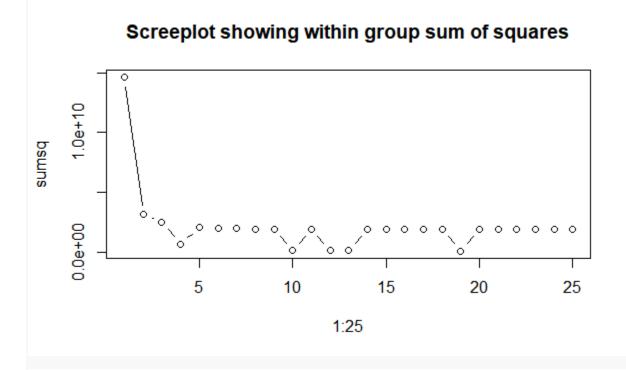
```
## 1252 0.000
                      145
                                 0
                                      0
                                             10
                                                 2
## 1074 3.125
                      757
                                54
                                     36
                                            936 1
# profiles of clusters
aggregate (df_train [, 1:5], list(df_train[,6]),mean)
                      calories protein
                                                       sodium
  Group.1 rating
                                              fat
         1 4.1360029 371.4242 14.251082 20.58586
                                                      478.3218
2
         2 0.1588983 300.1525 7.711864 16.27119
                                                       341.8305
3
         3 4.1015625 1928.0833 98.333333 127.50000 6324.0208
table(df1$rating)
##
##
          1.25 1.875
                         2.5 3.125
                                      3.75 4.375
                                                       5
##
            123
                    81
                         405 1165
                                      4136 6552 2106
    1296
table(df1$calories)
##
##
                               2
                                                              5
                                                                                  7
           0
                     1
                                         3
                                                   4
                                                                        6
                                                   7
                                         7
                                                             1
                                                                                  5
##
           8
                     4
                                                                        9
                              11
##
           8
                     9
                              10
                                        11
                                                  12
                                                             13
                                                                       14
                                                                                 15
##
           5
                     6
                               8
                                                   9
                                         9
                                                             12
                                                                       10
                                                                                 12
##
          16
                    17
                              18
                                        19
                                                  20
                                                             21
                                                                       22
                                                                                 23
##
          13
                     9
                              13
                                        21
                                                  18
                                                             18
                                                                       15
                                                                                 19
##
          24
                    25
                              26
                                        27
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                                                       4157357
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```

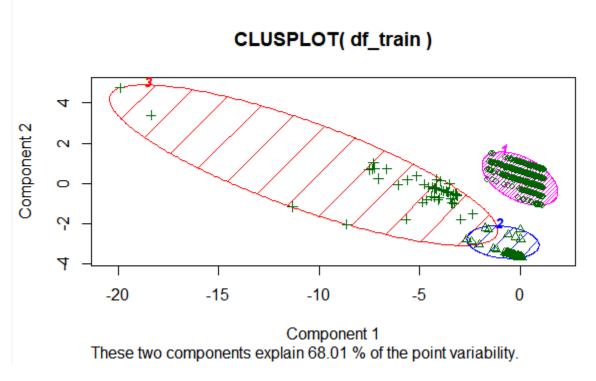
```
## 29997918 30111218
##
           1
                      1
table(df1$X22.minute.meals)
##
##
        0
               1
## 15849
              15
table(df1$sodium)
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```

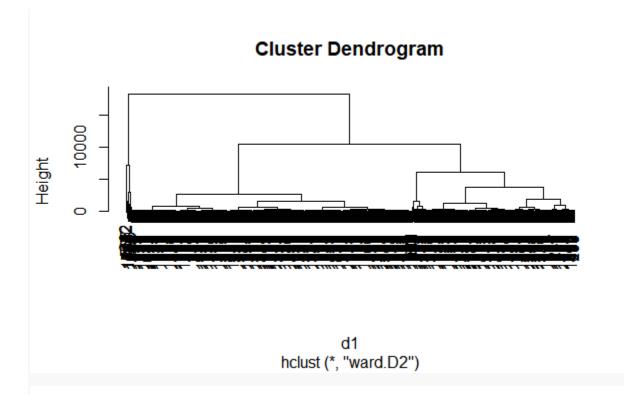
##	16	27	24	26	30	20	11	23
##	160	161	162	163	164	165	166	167
##	25	17	28	28	18	18	1 5	15
##	168	169	170	171	172	173	174	175
##	22	18	28	15	19	19	19	15
##	176	177	178	179	180	181	182	183
##	16	16	16	16	18	13	24	10
##	184	185	186	187	188	189	190	191
##	29	13	13	14	16	16	13	20
##	192	193	194	195	196	197	198	199
##	6	15	23	11	21	15	26	24
##	200	201	202	203	204	205	206	207
##	21	21	26	25	26	15	24	13
##	208	209	210	211	212	213	214	215
##	19	15	17	19	20	18	14	15
##	216	217	218	219	220	221	222	223
##	17	13	14	19	23	14	12	10
##	224	225	226	227	228	229	230	231
##	15	14	18	9	14	16	21	27
##	232	233	234	235	236	237	238	239
##	19	13	16	16	14	22	12	17
##	240	241	242	243	244	245	246	247
##	15	22	21	25	18	17	14	10
##	248	249	250	251	252	253	254	255
##	12	17	19	16	20	15	14	14
##	256	257	258	259	260	261	262	263
##	18	10	14	8	20	10	10	10
##	264	265	266	267	268	269	270	271
##	12	12	19	17	15	12	14	11
##	272	273	274	275	276	277	278	279
##	21	8	10	11	12	6	11	11
##	280	281	282	283	284	285	286	287
##	10	14	10	13	13	11	10	10
##	288	289	290	291	292	293	294	295
##	11	10	15	9	14	18	16	19
##	296	297	298	299	300	301	302	303
##	20	22	19	17	12	13	19	14
##	304	305	306	307	308	309	310	311
##	10	19	12	18	10	15	10	11
##	312	313	314	315	316	317	318	319
	312	313	31.	313	310	31,	310	313
##	1	2	1	1	1	1	2	1
##	7224	7273	7279	7302	7546	7666	7695	7707
##	1	1	1	7502	7 540	1	7093	1
##	7887	7955	8014	8023	8112	8187	8197	8470
##	1	7933	1	1	1	1	1	1
##	8644	8748	8945	9040	9286	9465	9478	9573
##	1	1	2	1	1	9403 1	9478 1	1
##	9792	10042	10231	10543	10635	10672	11150	11298
##	9792 2	10042	10231	10545	10055	10072	2	11298
ππ						1		7

```
##
      11306
               11349
                         11416
                                   11428
                                            11451
                                                     11462
                                                               11628
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##
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      11779
               11846
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                                   12450
                                            12845
                                                     12862
                                                               13006
                                                                        13430
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                                   13806
                                            13820
                                                     13869
                                                               13875
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                         15065
                                   15300
                                            15350
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      16104
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                                                     90572
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                                                   7540990 12005810 27570999
                             2
##
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                    1
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## 27675110
##
library(cluster)
clusplot(df train,df train$cl,cex=0.9,color=T,shade=T, labels=4,lines=0)
#HC clustering or Hierarchical Clustering
# distance (euclidean, manhattan, cosine distance)
# Divisive method (top down)
# Agglomorative method (bottom up)
df_train = df_train[,-5]
head(df train)
        rating calories protein fat cl
## 146
         3.750
                      67
                               2
                                   4
                                      1
## 785
         5.000
                               3
                                  14
                                      1
                     228
                               7
## 769
         4.375
                     441
                                  22
                                      1
## 1252 0.000
                     145
                               0
                                   0
                                      2
## 1074
         3.125
                     757
                              54
                                  36
                                      1
## 803
         4.375
                     285
                               3
                                   2 1
# compute the distance metrix
d1 <- dist(df_train,method='euclidean')</pre>
summary(d1)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                Max.
                              437.8 510.4 8650.4
##
       0.0 111.2
                      255.8
```

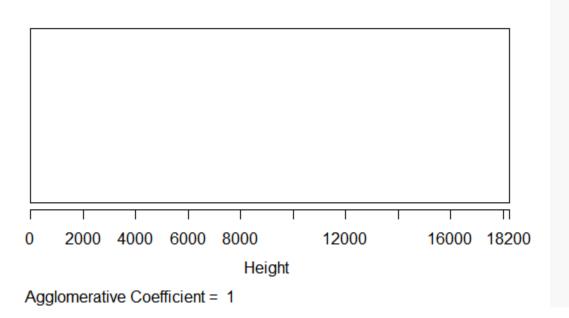
```
# HC
fit <- hclust(d1,method = 'ward.D2')</pre>
plot(fit)
# single, double, average, ward, ward.D2
# agglomorative method
fit <- agnes(d1,metric='euclidean',method = 'ward')</pre>
plot(fit)
# divisive method
fit <- diana(d1,metric='euclidean')</pre>
plot(fit)
                                  0.0e+00 2.5e+07
    Ø
                                  0.0e+00 2.5e+07
    1000000
```



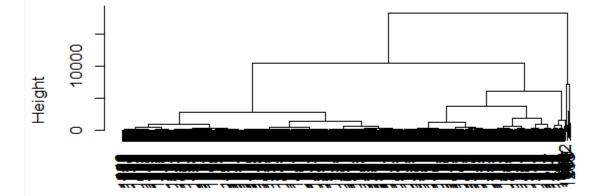












d1 Agglomerative Coefficient = 1

Banner of diana(x = d1, metric = "euclidean")

