HUDK4050: Class Activity 6 Response

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Data Management

```
library(tidyverse)
## -- Attaching packages -----
## v ggplot2 3.2.1
                           v purrr
                                     0.3.2
## v tibble 2.1.3
                          v dplyr 0.8.3.9000
## v tidyr 1.0.0
                           v stringr 1.4.0
## v readr
           1.3.1
                           v forcats 0.4.0
## -- Conflicts -----
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                    masks stats::lag()
#Load data
DF1 <- read.csv("HUDK405019-clustering.csv", header = TRUE)
#Convert the index numbers of the data frame into the student names.
DF2 <- unite(DF1, col = "Name", 1:2, sep = "_")</pre>
rownames(DF2) <- DF2$Name
#Wrangle data using dplyr to include only the numerical values.
library(varhandle)
library(purrr)
DF3 <- DF2 %>%
        select("months_in_NYC" = How.many.months.have.you.lived.in.New.York.City.,
               "siblings" = How.many.siblings..brothers.sisters..do.you.have.,
               "sport_per_week" = How.many.times.do.you.play.sport.each.week.,
               "miles_from_home" = How.many.miles.do.you.travel.from.home.to.TC.,
               "android_friends" = Estimate.how.many.of.your.friends.own.Android.phones,
               "movies_per_year" = How.many.movies.have.you.seen.in.the.cinema.this.year.,
               "pets" = How.many.pets.have.you.owned.in.your.life.,
               "people_met" = How.many.people.have.you.met.for.the.first.time.this.year.,
               "cook_per_week" = How.many.time.do.you.cook.for.yourself.each.week.,
               "class_load" = How.many.classes.are.you.taking.this.semester.,
               "states_visited" = How.many.states.have.you.visited.in.the.US.,
               "latitude" = What.is.the.latitude.of.the.city.town.you.grew.up.in...Look.up.on.a.map.ser
               "longitude" = What.is.the.longitude.of.the.city.town.you.grew.up.in.
       mutate("miles_from_home" = as.numeric(unfactor(miles_from_home))) %>%
        mutate("months_in_NYC" = as.numeric(unfactor(months_in_NYC))) %>%
```

```
mutate("android_friends" = as.numeric(unfactor(android_friends))) %>%
        mutate("states_visited" = as.numeric(unfactor(states_visited)))
## Warning: NAs introduced by coercion
#Remove spaces
DF3$latitude <- gsub("[[:space:]]", "", DF3$latitude)</pre>
DF3$longitude <- gsub("[[:space:]]", "", DF3$longitude)
#Remove non-numbers
DF3$latitude <- gsub("[^[:digit:].]", "", DF3$latitude)
DF3$longitude <- gsub("[^[:digit:].]", "", DF3$longitude)
#Get first 3 characters
DF3$latitude <- substring(DF3$latitude, first = 1, last = 3)
DF3$longitude <- substring(DF3$longitude, first = 1, last = 3)
#convert to numeric
DF3$latitude <- as.numeric(DF3$latitude)</pre>
DF3$longitude <- as.numeric(DF3$longitude)
#Scale the data so that no variable has undue influence
DF4 <- DF3 %>% scale() %>% as.data.frame()
#The algorithm can't accept NAs, so we need to either remove them or change them to be the average of v
#I've opted for the latter approach.
col_means <- map_dbl(DF4, mean, na.rm = TRUE) %>% as.list()
DF4 <- replace_na(DF4, replace = col_means)</pre>
```

Find lattitudes & longitudes for cities

```
#Unfortunately Google has restricted access to the Googple Maps API so the code below no longer works.
#install.packages("ggmap")
#install.packages("rgdal")
#library(ggmap)
#library(tmaptools)

#Request lattitude and longitude from Google Maps API
#DF2 <- geocode(as.character(DF2$Q1_1), output = "latlon", source = "dsk")</pre>
```

Now we will run the K-means clustering algorithm we talked about in class. 1) The algorithm starts by randomly choosing some starting values 2) Associates all observations near to those values with them 3) Calculates the mean of those clusters of values 4) Selects the observation closest to the mean of the cluster 5) Re-associates all observations closest to this observation 6) Continues this process until the clusters are no longer changing

Notice that in this case we have 10 variables and in class we only had 2. It is impossible to vizualise this process with 10 variables.

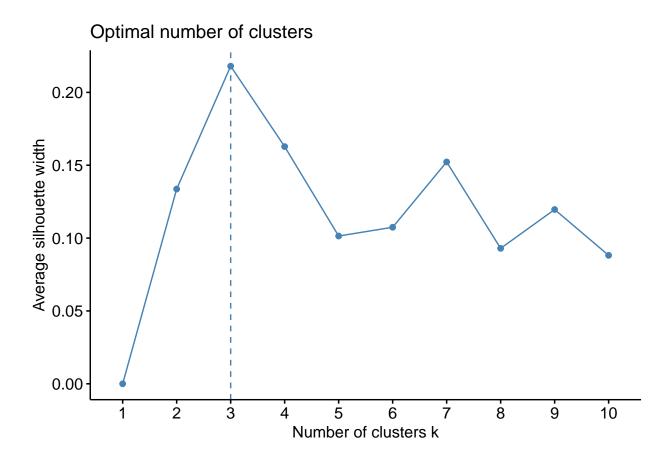
Also, we need to choose the number of clusters we think are in the data. We will start with 4.

```
#Choosing number of factors using elbow method library(factoextra)
```

Welcome! Related Books: `Practical Guide To Cluster Analysis in R` at https://goo.gl/13EFCZ

fviz_nbclust(DF4, kmeans)

#Computing K means clustering with 5 clusters



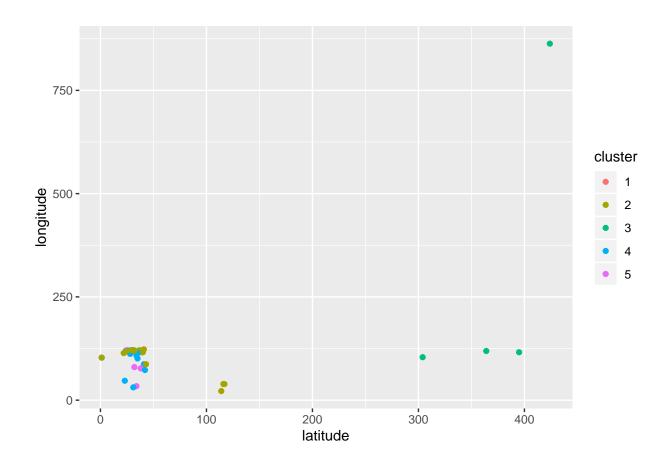
```
fit <- kmeans(DF4, 5)

#We have created an object called "fit" that contains all the details of our clustering including which
#Examining the structure of fit
glimpse(fit)</pre>
```

```
## List of 9
## $ cluster
               : int [1:50] 5 4 2 4 4 2 2 4 2 2 ...
               : num [1:5, 1:13] -0.283 -0.314 -0.336 -0.23 2.586 ...
    ..- attr(*, "dimnames")=List of 2
    ....$ : chr [1:5] "1" "2" "3" "4" ...
##
    ....$ : chr [1:13] "months_in_NYC" "siblings" "sport_per_week" "miles_from_home" ...
## $ totss
               : num [1:5] 0 189.9 60.4 106.7 37.4
## $ withinss
## $ tot.withinss: num 394
## $ betweenss : num 235
## $ size
               : int [1:5] 1 25 4 15 5
               : int 2
## $ iter
## $ ifault
               : int 0
## - attr(*, "class")= chr "kmeans"
#We can access the list of clusters by typing "fit$cluster", the top row corresponds to the original or
fit$cluster
## [36] 5 5 5 4 2 4 3 4 4 2 2 2 2 2 3
#We can also attach these clusters to the original dataframe by using the "data.frame" command to creat
K4 <- data.frame(DF3, fit$cluster) %>%
       rename(cluster = fit.cluster)
K4$cluster <- as.factor(K4$cluster)</pre>
#Have a look at the DF3 dataframe. Lets change the names of the variables to make it more convenient wi
names(DF3) <- c("1", "2", "3", "4", "5", "cluster") #c() stands for concatonate and it creates a vector
```

Visualize your clusters in ggplot

```
#Create a scatterplot that plots location of each student and colors the points according
ggplot(K4, aes(x = latitude, y = longitude, color = cluster)) + geom_point()
## Warning: Removed 1 rows containing missing values (geom_point).
```



Can you group students from the classes data set in Assignment 2 using K-modes?

```
#Load the data
load("assn2.RData")

#Assign rownames
rownames(person_class_DF) <- person_class_DF$id

## Warning: Setting row names on a tibble is deprecated.

person_class_DF_2 <- person_class_DF %>% dplyr::select(-id)

#Perform k means clustering with 4 clusters
library(klaR)

## Loading required package: MASS

##
## Attaching package: 'MASS'
```

```
## The following object is masked from 'package:dplyr':
##
##
       select
class_fit <- kmodes(person_class_DF, 4)</pre>
#Import igraph
library(igraph)
##
## Attaching package: 'igraph'
## The following objects are masked from 'package:dplyr':
##
       as_data_frame, groups, union
##
## The following objects are masked from 'package:purrr':
##
##
       compose, simplify
## The following object is masked from 'package:tidyr':
##
##
       crossing
## The following object is masked from 'package:tibble':
##
##
       as_data_frame
## The following objects are masked from 'package:stats':
##
##
       decompose, spectrum
## The following object is masked from 'package:base':
##
##
       union
#Attach cluster info to the original dataframe
plot.igraph(person_person_graph_data,
     layout = layout.fruchterman.reingold,
     vertex.size = 10,
     vertex.color = class_fit$cluster,
     vertex.label.cex = 0.4
```

