Lab 2 Assignment

```
library(ISLR)
library(MASS)
library(tidyverse)
## -- Attaching packages
                                                    ----- tidyverse 1.3.1 --
## v ggplot2 3.3.5
                               0.3.4
                     v purrr
## v tibble 3.1.6
                               1.0.7
                     v dplyr
## v tidyr
            1.1.4
                     v stringr 1.4.0
## v readr
            2.1.1
                     v forcats 0.5.1
## -- Conflicts -----
                                             ## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                   masks stats::lag()
## x dplyr::select() masks MASS::select()
library(caret)
## Loading required package: lattice
## Attaching package: 'caret'
## The following object is masked from 'package:purrr':
##
##
      lift
```

Lab Assignment

Q1. Discuss this example with your group. (no submission needed)

Galton's data on the heights of parents and their children, by child.

This data set lists the individual observations for 934 children in 205 families on which Galton (1886) based his cross-tabulation.

Suppose you are tasked with building a machine learning algorithm that predicts the son's height X, using the father's height X.

```
library(HistData)

#?GaltonFamilies
head(GaltonFamilies)
```

```
family father mother midparentHeight children childNum gender childHeight
##
## 1
        001
              78.5
                      67.0
                                      75.43
                                                    4
                                                                  male
                                                                               73.2
               78.5
                      67.0
                                      75.43
                                                                               69.2
## 2
        001
                                                    4
                                                              2 female
## 3
        001
              78.5
                      67.0
                                      75.43
                                                    4
                                                             3 female
                                                                               69.0
## 4
        001
              78.5
                      67.0
                                      75.43
                                                              4 female
                                                                               69.0
## 5
        002
              75.5
                      66.5
                                      73.66
                                                    4
                                                                               73.5
                                                                  male
## 6
        002
              75.5
                      66.5
                                      73.66
                                                                  male
                                                                               72.5
```

```
table(GaltonFamilies$family)
##
                            005
                                  006
                                        007
                                              800
                                                    009
##
    001
          002
                003
                      004
                                                          010
                                                                011
                                                                      012
                                                                            013
                                                                                  014
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##
       4
             4
                   2
                         5
                               6
                                     1
                                           6
                                                 3
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                                                             1
                                                                   8
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##
    017
          018
                019
                      020
                            021
                                  022
                                        023
                                              024
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                                                                            029
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                                                                                        031
                                                                                              032
##
       6
             3
                   1
                         8
                               3
                                     3
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                                                 1
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                                                             5
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                                                                        6
                                                                              3
                                                                                    1
                                                                                          6
                                                                                                5
    033
          034
                035
                      036
                            037
                                  038
                                        039
                                                    041
                                                          042
                                                                043
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                                                                                  046
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##
                                              040
##
       5
                                     6
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                                                                                    8
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             1
                   5
                         4
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                                                 5
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                                        055
          050
##
    049
                051
                      052
                            053
                                  054
                                              056
                                                    057
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                                                                059
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                                                                            061
                                                                                  062
                                                                                        063
                                                                                              064
##
       7
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          066
                067
                      068
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                                  070
                                        071
                                              072
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                                                                                        079
                                                                                              080
                                                                  7
##
                   4
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                                                                        7
                                                                                    5
                                                                                          8
       1
            11
                         5
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                                                                                                 1
##
    081
          082
                083
                      084
                            085
                                  086
                                        087
                                              880
                                                    089
                                                          090
                                                                091
                                                                      092
                                                                            093
                                                                                  094
                                                                                        095
                                                                                              096
       4
                               5
                                                             7
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##
             9
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##
    097
          098
                099
                      100
                            101
                                  102
                                        103
                                              104
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                                                                      108
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##
      10
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    113
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       1
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                                        135
                                              136 136A
    129
          130
                131
                            133
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                                                                                  141
                                                                                        142
##
                      132
                                  134
                                                                138
                                                                            140
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                               7
##
       3
            11
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                                           8
                                                10
                                                      8
                                                             4
                                                                  5
                                                                         1
                                                                             10
                                                                                    8
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##
    144
          145
                146
                      147
                            148
                                  149
                                        150
                                              151
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##
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                                                                                    1
          161
                162
##
    160
                      163
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##
       1
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                         5
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                                         11
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##
    176
          177
                178
                      179
                            180
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##
       8
             5
                         2
                               6
                                     7
                                           1
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                                                       1
                                                            15
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                                                                                                2
          193
                194
                                  197
                                        198
                                              199
                                                          201
                                                                202
                                                                      203
                                                                            204
##
    192
                      195
                            196
                                                    200
##
       6
             6
                   2
                         3
                               4
                                     5
                                           7
                                                 7
                                                       1
                                                             2
                                                                   2
                                                                         3
set.seed(1983)
galton_heights <- GaltonFamilies %>%
  filter(gender == "male") %>%
  group_by(family) %>% #grouped data frame
  sample n(1) %>%
  ungroup() %>% #removes grouping
  select(father, childHeight) %>%
  rename(son = childHeight)
head(galton_heights)
## # A tibble: 6 x 2
##
      father
                son
##
       <dbl> <dbl>
## 1
        78.5
              73.2
## 2
        75.5
              72.5
## 3
        75
               71
## 4
        75
               70.5
## 5
        75
               69
## 6
        74
               76.5
  (i) Let's split the data into training and testing.
```

#slice() lets you index rows by their (integer) locations.

```
#It allows you to select, remove, and duplicate rows.

y <- galton_heights$son
test_index <- createDataPartition(y, times = 1, p = 0.3, list = FALSE) #30% for the test set
train_set <- galton_heights %>% slice(-test_index)
test_set <- galton_heights %>% slice(test_index)

(ii) The best guess(prediction) would be the mean;
(yhat <- mean(train_set$son))

## [1] 69.14839</pre>
```

```
# then the error would be (yhat-ybar)
mean((yhat - test_set$son)^2)
```

[1] 7.738353

(iii) Can we do better? Yes.

$$f(x) = E(Y|X = x) = \beta_0 + \beta_1 x$$

```
fit <- lm(son ~ father, data = train_set)
fit$coef</pre>
```

(Intercept) father ## 37.6101619 0.4570757

$$\hat{f}(x) = 43.7 + 0.36x$$

We can see that this does indeed provide an improvement over our guessing approach.

```
y_hat <- fit$coef[1] + fit$coef[2]*test_set$father
mean((y_hat - test_set$son)^2)</pre>
```

[1] 6.634095

(iv) Predict

```
y_hat <- predict(fit, test_set)
mean((y_hat - test_set$son)^2)</pre>
```

[1] 6.634095

Learn more;

```
?predict.lm
?predict.glm
```

many machine learning algorithms have a predict function.

Q2: Coefficient Interpretation

Suppose we have the following model to estimate GPA for Georgetown undergraduate students.

$$GPA = \beta_0 + \beta_1 * Female + \beta_2 Age$$

Where Age is a continuous variable measured in years and gender is encoded as:

- Female = 1 if student is female
- Female = 0 if student is male
- a) What is the interpretation of the β_0 coefficient?
- b) What is the interpretation of the β_1 coefficient?
- c) Suppose $\beta_0 = 1.5$ and $\beta_1 = .5$ and $\beta_2 = 1.5$. What is the expected GPA of a student who is male and 20 years old?
- d) Suppose you believe that males have lower GPAs than females. Further, suppose you believe that GPA tends to decrease as students get older. What would this imply about the signs of the coefficients of the model?
- e) Suppose we change the units of measurement for Age from years to days. What effect would that have on β_2 ? This is an important reminder about interpreting the absolute magnitude of the coefficients.

Question 3

Data Science Question: Are the variables contributing for predicting "Valence" of the songs is same for both musicians; Taylor Swift and John Legend?

Valence: A measure from 0.0 to 1.0 describing the musical positiveness conveyed by a track. Tracks with high valence sound more positive (e.g. happy, cheerful, euphoric), while tracks with low valence sound more negative (e.g. sad, depressed, angry).

```
Artists <- read.csv("Artists.csv", header = TRUE)
head(Artists)</pre>
```

```
X artist_name Valence danceability energy loudness speechiness acousticness
## 1 1 Taylor Swift
                      0.328
                                    0.594 0.713
                                                    -5.314
                                                                0.0503
                                                                            0.000328
## 2 2 Taylor Swift
                      0.408
                                    0.516
                                           0.777
                                                    -4.908
                                                                0.0375
                                                                            0.001080
## 3 3 Taylor Swift
                      0.299
                                                    -6.506
                                    0.645 0.593
                                                                0.0288
                                                                            0.034400
## 4 4 Taylor Swift
                      0.767
                                    0.584
                                                    -6.371
                                                                0.0342
                                                                            0.012900
                                           0.557
## 5 5 Taylor Swift
                      0.132
                                    0.440
                                           0.528
                                                    -7.809
                                                                0.0317
                                                                            0.017100
## 6 6 Taylor Swift
                      0.642
                                    0.642 0.695
                                                    -5.620
                                                                            0.000443
                                                                0.0281
     liveness
                                                        track name
                tempo
       0.1140 129.958
                                State Of Grace (Taylor's Version)
## 1
## 2
       0.0761 125.047
                                           Red (Taylor's Version)
## 3
       0.1300 109.984
                                   Treacherous (Taylor's Version)
       0.0576 154.008 I Knew You Were Trouble (Taylor's Version)
       0.2340 185.972
                                  All Too Well (Taylor's Version)
## 5
## 6
       0.0753 103.984
                                            22 (Taylor's Version)
##
                 album_name album_release_year
## 1 Red (Taylor's Version)
                                            2021
## 2 Red (Taylor's Version)
                                            2021
## 3 Red (Taylor's Version)
                                           2021
## 4 Red (Taylor's Version)
                                           2021
## 5 Red (Taylor's Version)
                                           2021
## 6 Red (Taylor's Version)
                                            2021
```

Create a new variable with the name "danceable" and add it to the "Artists" data set. Fill this variable with values "High", "Medium", "Low" according to the danceability value such that 0.8-1 is "High", 0.5-0.79 is "Medium" and 0.0-0.49 is "Low".

```
Artists$danceable<-rep(0, nrow(Artists))
```

```
Artists1 <- within(Artists, {</pre>
  danceable[danceability>= 0.800 & danceability <= 1] <- "High"</pre>
  danceable[danceability>= 0.500 & danceability < 0.8] <- "Medium"
  danceable[danceability <= 0.499] <- "Low"</pre>
})
head(Artists1)
     X artist_name Valence danceability energy loudness speechiness acousticness
## 1 1 Taylor Swift
                      0.328
                                    0.594 0.713
                                                   -5.314
                                                                0.0503
                                                                           0.000328
## 2 2 Taylor Swift
                      0.408
                                    0.516 0.777
                                                   -4.908
                                                                0.0375
                                                                           0.001080
## 3 3 Taylor Swift
                      0.299
                                    0.645 0.593
                                                   -6.506
                                                                0.0288
                                                                           0.034400
## 4 4 Taylor Swift
                      0.767
                                    0.584 0.557
                                                   -6.371
                                                                0.0342
                                                                           0.012900
## 5 5 Taylor Swift
                      0.132
                                    0.440
                                           0.528
                                                    -7.809
                                                                0.0317
                                                                           0.017100
                      0.642
                                    0.642 0.695
                                                    -5.620
                                                                0.0281
                                                                           0.000443
## 6 6 Taylor Swift
     liveness
                tempo
                                                        track_name
## 1
       0.1140 129.958
                                State Of Grace (Taylor's Version)
## 2
       0.0761 125.047
                                           Red (Taylor's Version)
## 3
       0.1300 109.984
                                   Treacherous (Taylor's Version)
      0.0576 154.008 I Knew You Were Trouble (Taylor's Version)
       0.2340 185.972
## 5
                                  All Too Well (Taylor's Version)
       0.0753 103.984
## 6
                                            22 (Taylor's Version)
##
                 album_name album_release_year danceable
## 1 Red (Taylor's Version)
                                           2021
                                                   Medium
## 2 Red (Taylor's Version)
                                           2021
                                                   Medium
## 3 Red (Taylor's Version)
                                           2021
                                                   Medium
## 4 Red (Taylor's Version)
                                           2021
                                                   Medium
## 5 Red (Taylor's Version)
                                           2021
                                                       Low
## 6 Red (Taylor's Version)
                                           2021
                                                   Medium
```

Just do the analysis for John Legend.

a. Fit a linear regression models separately for Artists: *John Legend*, to predict *Valence* of the songs on all the quantitative variables in the data set and "danceable" variable you created earlier.

Remember to train your model on a training set and validate the model using a validation set.

b. Check the multicollinearity c. In cooperate interaction terms c. what is the best model? with or without the ineractions?