# How to Judge an App By Its Cover

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### Introduction

The question that all users have is, "which app is better?" This project will help give a better understanding on how to determine if a certain app is considered better or well-rounded compared to others. This decision will be based on the data the users retrieve from the app's descriptions in the Play Store (e.g. ratings, downloads, price, etc.) This measurement will be a good standard guideline on whether the app the user is looking into is good or not. There will be a measurement for every genre in the app store as well as an overall app rating.

Clients: App creators and App users

Data: Data from the Play Store

### **DataSets**

#### • Googleplaystore.csv:

A table that consists of ten thousand apps from Google Play Store with data of ratings, reviews, size of the app, number of installs, price, content rating, and genre. I plan to use most if not all of the variables provided to determine the measurement. I plan to use the mean or the most common of each category to find what an ideal app for their genre would be.

#### • Googleplaystore\_user\_reviews.csv:

A table that consists of over sixty thousand comments posted on Google Play Store for each app. The table has data on whether the comment is positive, negative, or neutral. I plan on using the data and help determine if there is a correlation between the ratio of positive and negative to the ratings, which will be used in determining the measurement.

# Data Cleaning

<pre>library(dplyr)</pre>	
##	
## Attaching package: 'dplyr'	

```
## The following objects are masked from 'package:stats':
##
## filter, lag
```

```
## The following objects are masked from 'package:base':
##
## intersect, setdiff, setequal, union
```

```
#Load files
googleplaystore <- read.csv("googleplaystore.csv")</pre>
#Remove the entire row of data if it contains NaN in googleplaystore
googleplaystore <- googleplaystore %>% filter(!grepl(NaN, Rating))
googleplaystore <- googleplaystore %>% filter(!grepl(NaN, Current.Ver))
#Remove the entire row of data if it contains; in the column genres in googleplaystore
googleplaystore <- googleplaystore %>% filter(!grepl(";", Genres))
#googleplaystore
#Remove the entire row of data if it contains varies with device in column size in googleplaysto
googleplaystore <- googleplaystore %>% filter(!grepl("Varies with device", Size
                                                                                     ))
#Remove the last 3 columns because it won't be used in googleplaystore
googleplaystore <- select(googleplaystore, -c(Last.Updated,Current.Ver,Android.Ver))</pre>
#Remove all the $ signs in the price column in googleplaystore
googleplaystore$Price <- ifelse(grep1("\\$", googleplaystore$Price), gsub("\\$", "", googleplays</pre>
tore$Price), googleplaystore$Price)
```

• In the code above, I cleaned up some of the data in Googleplaystore.csv so it was ready to be used. I first imported dplyr since that's the tool I'll be using to clean my data up. I then opened the csv while setting it to a variable so it's easy to use. I removed all rows that contained NaN, since it is incomplete data. After that, I removed all rows that contains a semi colon in the column, genres, because I wanted to use specific genres and not mixed. I also removed all the rows that contained varies with device in the column, size, since I wanted all numbers and varies with device is not usable. In addition, I removed the last 3 columns of the csv file because I didn't plan on using any of those data in my project. Lastly, I removed all the dollar signs in the column, price, so I can use the numbers while not having to worry about problems with the dollar sign being in the way.

```
#Load files
googleplaystore_reviews <- read.csv("googleplaystore_user_reviews.csv")
#Remove the entire row of data if it contains NaN in googleplaystore_reviews
googleplaystore_reviews <- googleplaystore_reviews %>% filter(!grepl(NaN, Translated_Review))
googleplaystore_reviews <- googleplaystore_reviews %>% filter(!grepl(NaN, Sentiment_Polarity))
googleplaystore_reviews <- googleplaystore_reviews %>% filter(!grepl(NaN, Sentiment_Subjectivit
y))
#Remove the last column because it won't be used in googleplaystore_reviews
googleplaystore_reviews <- select(googleplaystore_reviews, -c(Sentiment_Subjectivity))</pre>
```

In the code above, I cleaned up some of the data in Googleplaystore\_user\_reviews.csv so it
was ready to be used. I first opened the csv while setting it to a variable so it's easy to use.

Then, I removed all rows that contained NaN, since it is incomplete data. Lastly, I removed the last column of the csv file because I didn't plan on using any of those data in my project.

## Data analysis

```
#Summary of googleplaystore
summary(googleplaystore)
```

```
##
                          Category
                                                Rating
                                                               Reviews
        App
    Length:7310
##
                        Length:7310
                                           Min.
                                                   : 1.000
                                                             Length:7310
##
    Class :character
                        Class :character
                                           1st Qu.: 4.000
                                                             Class :character
    Mode :character
                       Mode :character
                                           Median : 4.300
##
                                                             Mode :character
##
                                                   : 4.169
                                           Mean
##
                                            3rd Qu.: 4.500
##
                                           Max.
                                                   :19.000
##
        Size
                          Installs
                                                Type
                                                                  Price
    Length:7310
                        Length:7310
                                            Length:7310
                                                               Length:7310
##
    Class :character
                        Class :character
                                           Class :character
                                                               Class :character
##
##
    Mode :character
                       Mode :character
                                           Mode :character
                                                               Mode :character
##
##
##
##
    Content.Rating
                           Genres
    Length:7310
                        Length:7310
##
##
    Class :character
                        Class :character
##
    Mode :character
                       Mode :character
##
##
##
```

#Summary of googleplaystore\_reviews summary(googleplaystore\_reviews)

```
##
                        Translated Review
                                             Sentiment
                                                                Sentiment Polarity
        App
    Length: 37432
                        Length: 37432
                                            Length: 37432
##
                                                                Min.
                                                                       :-1.0000
    Class :character
                        Class :character
                                            Class :character
                                                                1st Qu.: 0.0000
##
    Mode :character
                        Mode :character
                                            Mode :character
                                                                Median : 0.1500
##
##
                                                                Mean
                                                                       : 0.1821
##
                                                                3rd Ou.: 0.4000
##
                                                                Max.
                                                                        : 1.0000
```

In the code above, I did a summary for both csv files.

```
#Head of googleplaystore
head(googleplaystore)
```

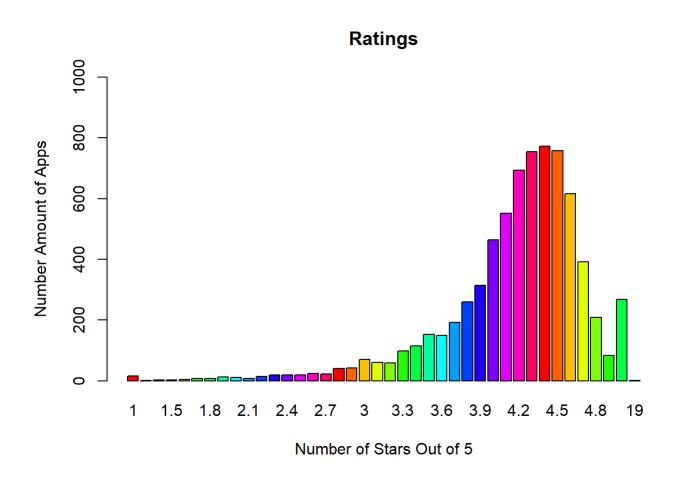
```
##
                                                       App
                                                                 Category Rating
           Photo Editor & Candy Camera & Grid & ScrapBook ART AND DESIGN
## 1
## 2 U Launcher Lite â\200" FREE Live Cool Themes, Hide Apps ART AND DESIGN
                                                                                 4.7
                                     Sketch - Draw & Paint ART AND DESIGN
## 3
                                                                              4.5
## 4
                                Paper flowers instructions ART AND DESIGN
                                                                              4.4
## 5
                  Smoke Effect Photo Maker - Smoke Editor ART AND DESIGN
                                                                              3.8
## 6
                                          Infinite Painter ART_AND_DESIGN
                                                                              4.1
##
     Reviews Size
                     Installs Type Price Content.Rating
                                                               Genres
## 1
         159 19M
                      10,000+ Free
                                        0
                                                Everyone Art & Design
       87510 8.7M 5,000,000+ Free
                                                Everyone Art & Design
## 2
      215644 25M 50,000,000+ Free
## 3
                                                    Teen Art & Design
## 4
         167 5.6M
                      50,000+ Free
                                                Everyone Art & Design
## 5
         178
             19M
                      50,000+ Free
                                                Everyone Art & Design
## 6
       36815
              29M
                   1,000,000+ Free
                                                Everyone Art & Design
```

```
#Head of googleplaystore_reviews
head(googleplaystore_reviews)
```

```
##
                       App
## 1 10 Best Foods for You
## 2 10 Best Foods for You
## 3 10 Best Foods for You
## 4 10 Best Foods for You
## 5 10 Best Foods for You
## 6 10 Best Foods for You
##
Translated Review
## 1 I like eat delicious food. That's I'm cooking food myself, case "10 Best Foods" helps lot,
also "Best Before (Shelf Life)"
## 2
                                                                                  This help eating
healthy exercise regular basis
## 3
                                                                                       Works great
especially going grocery store
## 4
Best idea us
## 5
Best way
## 6
Amazing
     Sentiment Sentiment Polarity
##
## 1
     Positive
                              1.00
## 2 Positive
                              0.25
## 3 Positive
                              0.40
## 4
      Positive
                              1.00
## 5
      Positive
                              1.00
## 6
     Positive
                              0.60
```

In the code above, I did the head for both csv files.

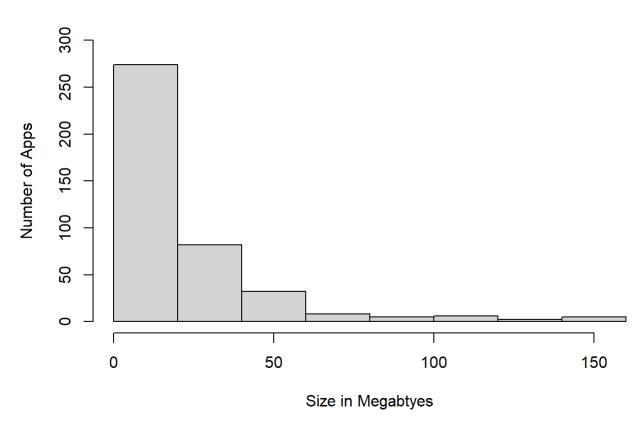
```
#Bargraph of googleplaystore ratings
total <- table(googleplaystore$Rating)
barplot(total, main = "Ratings", xlab = "Number of Stars Out of 5", ylab = "Number Amount of App
s", ylim = c(0,1000), col = rainbow(total))</pre>
```



• In the code above, I made a bargraph showing the ratings of all the apps.

```
#Histogram of googleplaystore size
total <- table(googleplaystore$Size)
hist(total, main = "Size", xlab = "Size in Megabtyes", ylab = "Number of Apps", ylim = c(0,300))</pre>
```

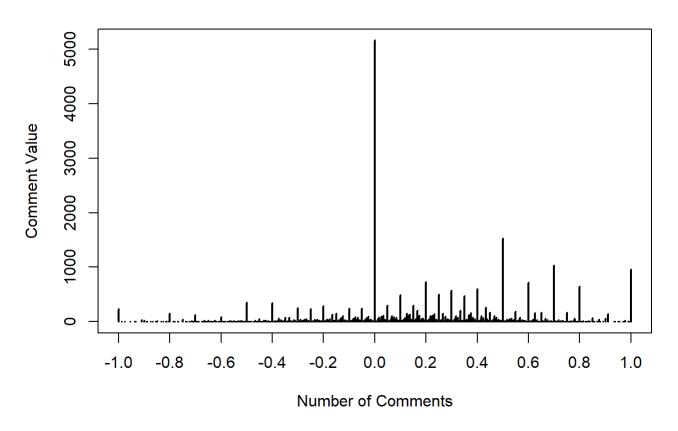




• In the code above, I made a histogram showing the sizes of all the apps.

```
#Plot of googleplaystore_reviews comment value
total <- table(googleplaystore_reviews$Sentiment_Polarity)
plot(total, main = "Comments", xaxt = "n", xlab = "Number of Comments", ylab = "Comment Value")
axis(side = 1, at=seq(-1,1, by = 0.2))</pre>
```

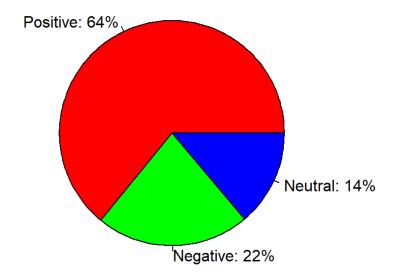
#### **Comments**



• In the code above, I made a plot showing the comment values of all the apps.

```
#PieChart of googleplaystore_reviews comment type
positive <- sum(googleplaystore_reviews$Sentiment == "Positive")
negative <- sum(googleplaystore_reviews$Sentiment == "Negative")
neutral <- sum(googleplaystore_reviews$Sentiment == "Neutral")
parts <- c(positive, negative, neutral)
names <- c("Positive", "Negative", "Neutral")
percent <- round(parts/sum(parts)*100)
names <- paste(names, sep = ": ", percent)
names <- paste(names, "%", sep = "")
pie(parts, main = "Comments", labels = names, col = rainbow(length(names)))</pre>
```

#### **Comments**



• In the code above, I made a pie chart showing the comment types of all the apps.

# Modeling

#Linear Regression of rating and price in googleplaystore
lm\_plot = lm(Rating ~ Price, data = googleplaystore)
summary(lm\_plot)

```
##
## Call:
   lm(formula = Rating ~ Price, data = googleplaystore)
##
## Residuals:
##
       Min
                 1Q Median
                                  3Q
                                          Max
                              0.3381
##
   -3.2479 -0.1619
                     0.1381
                                      0.9500
##
## Coefficients:
##
                  Estimate Std. Error t value Pr(>|t|)
                                                   <2e-16 ***
##
  (Intercept)
                   4.16192
                               0.00672 619.301
## Price0.99
                   0.12917
                               0.05555
                                          2.325
                                                   0.0201 *
## Price1.00
                   0.28808
                               0.39189
                                          0.735
                                                   0.4623
## Price1.20
                   0.03808
                               0.55417
                                          0.069
                                                   0.9452
## Price1.29
                  -0.06192
                               0.55417
                                         -0.112
                                                   0.9110
## Price1.49
                                                   0.9008
                   0.01308
                               0.10494
                                          0.125
## Price1.50
                   0.03808
                               0.55417
                                          0.069
                                                   0.9452
## Price1.61
                   0.03808
                               0.55417
                                          0.069
                                                   0.9452
## Price1.70
                   0.13808
                               0.39189
                                          0.352
                                                   0.7246
## Price1.75
                   0.83808
                               0.55417
                                          1.512
                                                   0.1305
## Price1.76
                   0.33808
                               0.55417
                                          0.610
                                                   0.5418
## Price1.97
                   0.33808
                               0.55417
                                          0.610
                                                   0.5418
## Price1.99
                   0.13808
                               0.08111
                                          1.702
                                                   0.0887 .
## Price10.00
                   0.43808
                               0.32000
                                          1.369
                                                   0.1710
## Price10.99
                  -0.66192
                               0.39189
                                         -1.689
                                                   0.0913 .
## Price11.99
                   0.13808
                               0.27715
                                          0.498
                                                   0.6183
## Price12.99
                   0.26308
                               0.27715
                                          0.949
                                                   0.3425
## Price13.99
                   0.13808
                               0.55417
                                          0.249
                                                   0.8032
## Price14.00
                   0.43808
                               0.55417
                                          0.791
                                                   0.4293
## Price14.99
                   0.13808
                               0.17536
                                          0.787
                                                   0.4311
## Price15.46
                  -0.76192
                               0.55417
                                         -1.375
                                                   0.1692
## Price15.99
                                          0.971
                   0.53808
                               0.55417
                                                   0.3316
## Price16.99
                   0.03808
                               0.32000
                                          0.119
                                                   0.9053
                  -0.41192
## Price17.99
                               0.39189
                                         -1.051
                                                   0.2932
## Price18.99
                   0.43808
                               0.55417
                                          0.791
                                                   0.4293
## Price19.40
                   0.53808
                               0.55417
                                          0.971
                                                   0.3316
## Price19.99
                   0.35808
                               0.24791
                                          1.444
                                                   0.1487
## Price2.00
                   0.23808
                               0.55417
                                          0.430
                                                   0.6675
## Price2.49
                   0.11808
                               0.14323
                                          0.824
                                                   0.4098
## Price2.56
                  -0.76192
                               0.55417
                                         -1.375
                                                   0.1692
## Price2.59
                   0.53808
                               0.55417
                                          0.971
                                                   0.3316
## Price2.90
                   0.03808
                               0.55417
                                          0.069
                                                   0.9452
## Price2.99
                   0.08602
                               0.06520
                                          1.319
                                                   0.1871
## Price24.99
                   0.21808
                               0.24791
                                          0.880
                                                   0.3791
## Price29.99
                  -0.11192
                               0.22632
                                         -0.495
                                                   0.6210
## Price299.99
                  -0.36192
                               0.55417
                                         -0.653
                                                   0.5137
## Price3.02
                   0.03808
                               0.55417
                                          0.069
                                                   0.9452
## Price3.04
                   0.83808
                               0.55417
                                          1.512
                                                   0.1305
## Price3.08
                               0.55417
                                          0.430
                   0.23808
                                                   0.6675
## Price3.28
                  -0.26192
                               0.55417
                                         -0.473
                                                   0.6365
## Price3.49
                   0.12141
                               0.22632
                                          0.536
                                                   0.5917
## Price3.88
                   0.43808
                               0.55417
                                          0.791
                                                   0.4293
## Price3.99
                   0.16475
                               0.10139
                                          1.625
                                                   0.1042
```

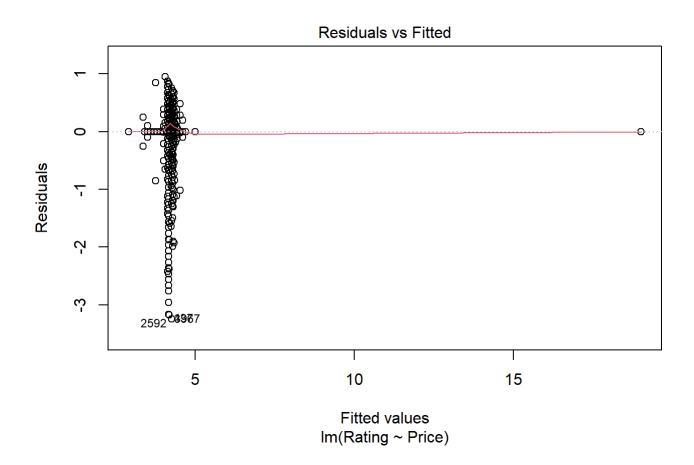
```
## Price33.99
                 -0.66192
                             0.39189 -1.689
                                               0.0913 .
## Price37.99
                                       0.069
                                               0.9452
                  0.03808
                             0.55417
                                               0.0228 *
## Price379.99
                 -1.26192
                             0.55417
                                      -2.277
## Price389.99
                                      -1.014
                 -0.56192
                             0.55417
                                               0.3106
## Price39.99
                 -0.16192
                             0.55417
                                      -0.292
                                               0.7702
                             0.16721 -0.914
                                               0.3608
## Price399.99
                 -0.15283
## Price4.29
                  0.43808
                             0.55417
                                       0.791
                                               0.4293
## Price4.49
                  0.25237
                             0.20955
                                       1.204
                                               0.2285
## Price4.60
                 -0.76192
                             0.55417 -1.375
                                               0.1692
## Price4.77
                 -0.36192
                             0.55417
                                      -0.653
                                               0.5137
## Price4.84
                 -0.06192
                             0.55417
                                      -0.112
                                               0.9110
## Price4.99
                 -0.03785
                             0.07571
                                      -0.500
                                               0.6172
## Price400.00
                                     -1.014
                 -0.56192
                             0.55417
                                               0.3106
## Price5.49
                  0.43808
                             0.39189
                                       1.118
                                               0.2637
## Price5.99
                  0.10731
                             0.15384
                                       0.698
                                               0.4855
## Price6.49
                 -0.76192
                             0.55417 -1.375
                                               0.1692
## Price6.99
                  0.02697
                             0.18483
                                       0.146
                                               0.8840
## Price7.49
                  0.03808
                             0.55417
                                       0.069
                                               0.9452
## Price7.99
                  0.18094
                             0.20955
                                       0.863
                                               0.3879
## Price79.99
                  0.43808
                             0.39189
                                       1.118
                                               0.2637
## Price8.49
                 -0.46192
                                      -0.834
                                               0.4046
                             0.55417
## Price8.99
                 -0.81192
                             0.39189
                                      -2.072
                                               0.0383 *
## Price9.00
                  0.03808
                             0.39189
                                       0.097
                                               0.9226
## Price9.99
                  0.07558
                             0.13870
                                       0.545
                                               0.5858
## PriceEveryone 14.83808
                             0.55417
                                      26.775
                                               <2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.5541 on 7242 degrees of freedom
## Multiple R-squared: 0.09751,
                                    Adjusted R-squared: 0.08916
## F-statistic: 11.68 on 67 and 7242 DF, p-value: < 2.2e-16
```

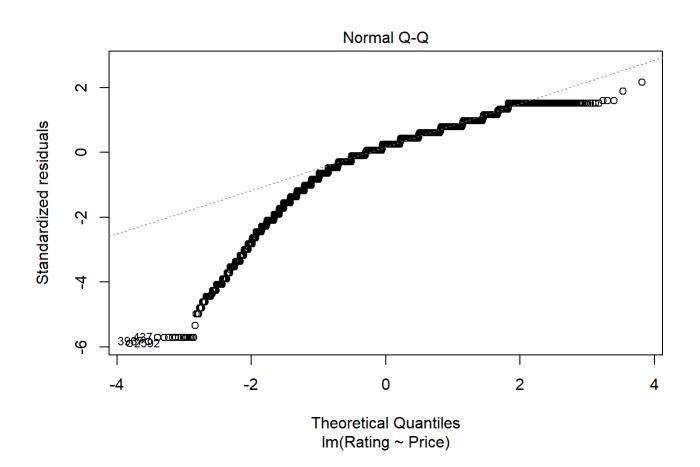
```
coefficients(lm plot)
```

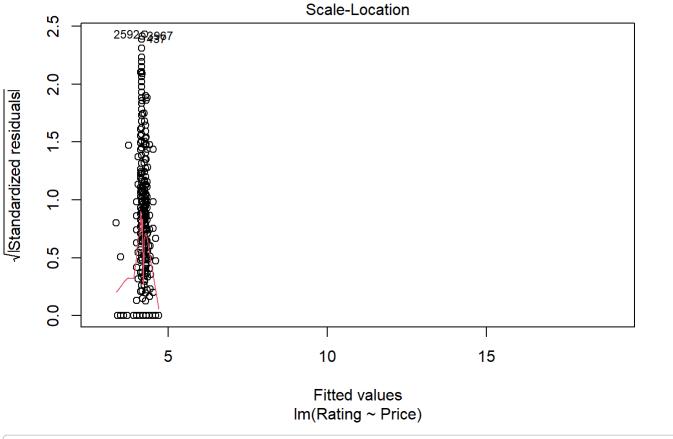
```
##
     (Intercept)
                      Price0.99
                                    Price1.00
                                                   Price1.20
                                                                  Price1.29
##
      4.16192087
                     0.12916824
                                   0.28807913
                                                  0.03807913
                                                                -0.06192087
##
       Price1.49
                      Price1.50
                                    Price1.61
                                                   Price1.70
                                                                  Price1.75
##
      0.01307913
                     0.03807913
                                   0.03807913
                                                  0.13807913
                                                                 0.83807913
##
       Price1.76
                      Price1.97
                                    Price1.99
                                                  Price10.00
                                                                 Price10.99
##
      0.33807913
                     0.33807913
                                   0.13807913
                                                  0.43807913
                                                                -0.66192087
##
      Price11.99
                     Price12.99
                                   Price13.99
                                                  Price14.00
                                                                 Price14.99
##
      0.13807913
                     0.26307913
                                   0.13807913
                                                  0.43807913
                                                                 0.13807913
##
      Price15.46
                     Price15.99
                                   Price16.99
                                                  Price17.99
                                                                 Price18.99
##
                     0.53807913
                                                                 0.43807913
     -0.76192087
                                   0.03807913
                                                 -0.41192087
                     Price19.99
                                                                  Price2.56
##
      Price19.40
                                    Price2.00
                                                   Price2.49
##
      0.53807913
                     0.35807913
                                   0.23807913
                                                  0.11807913
                                                                -0.76192087
##
       Price2.59
                      Price2.90
                                    Price2.99
                                                  Price24.99
                                                                 Price29.99
##
      0.53807913
                     0.03807913
                                   0.08602433
                                                  0.21807913
                                                                -0.11192087
##
     Price299.99
                      Price3.02
                                    Price3.04
                                                   Price3.08
                                                                  Price3.28
##
     -0.36192087
                     0.03807913
                                   0.83807913
                                                  0.23807913
                                                                -0.26192087
                                                  Price33.99
##
                      Price3.88
                                    Price3.99
       Price3.49
                                                                 Price37.99
##
      0.12141246
                     0.43807913
                                   0.16474580
                                                 -0.66192087
                                                                 0.03807913
##
     Price379.99
                    Price389.99
                                   Price39.99
                                                 Price399.99
                                                                  Price4.29
##
     -1.26192087
                                                                 0.43807913
                    -0.56192087
                                   -0.16192087
                                                 -0.15282996
##
       Price4.49
                      Price4.60
                                    Price4.77
                                                   Price4.84
                                                                  Price4.99
##
      0.25236484
                    -0.76192087
                                   -0.36192087
                                                 -0.06192087
                                                                -0.03784680
##
     Price400.00
                      Price5.49
                                    Price5.99
                                                   Price6.49
                                                                  Price6.99
##
     -0.56192087
                     0.43807913
                                   0.10730990
                                                 -0.76192087
                                                                 0.02696802
##
       Price7.49
                     Price7.99
                                   Price79.99
                                                   Price8.49
                                                                  Price8.99
##
                                                 -0.46192087
      0.03807913
                     0.18093627
                                   0.43807913
                                                                -0.81192087
##
       Price9.00
                      Price9.99 PriceEveryone
##
      0.03807913
                     0.07557913
                                  14.83807913
```

#### plot(lm\_plot)

```
## Warning: not plotting observations with leverage one:
## 1413, 2619, 2924, 3510, 3512, 3521, 3958, 4224, 4298, 4537, 4862, 5542, 5868, 5885, 6663, 7
079, 7275
```

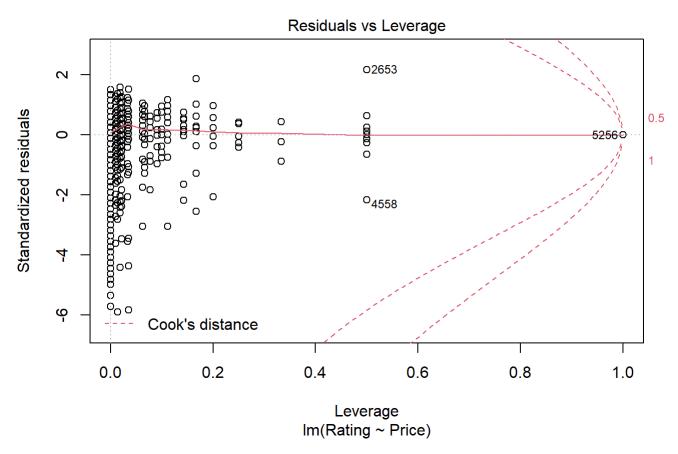






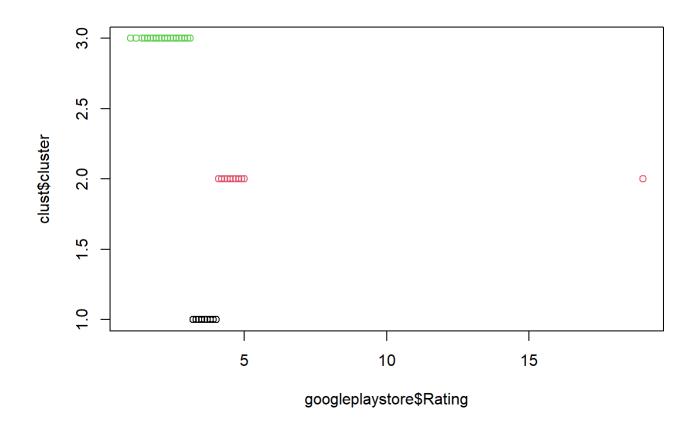
## Warning in sqrt(crit \* p \* (1 - hh)/hh): NaNs produced

## Warning in sqrt(crit \* p \* (1 - hh)/hh): NaNs produced

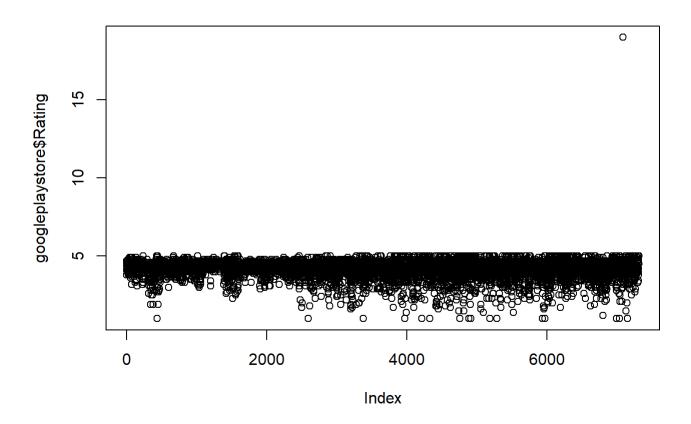


• In the code above, I used linear regression for the ratings and prices of all the apps to see their correlation.

```
#K-Means Cluster of rating in googleplaystore
clust <- kmeans(googleplaystore$Rating, centers = 3)
plot(googleplaystore$Rating, clust$cluster, col = factor(clust$cluster))</pre>
```



plot(googleplaystore\$Rating)



• In the code above, I used K\_Means Clustering for the ratings of all the apps to see the huge range of ratings in the dataset.

## **Data Product**

```
library(shiny)

## Warning: package 'shiny' was built under R version 4.0.3
```

```
ui <- fluidPage(</pre>
  titlePanel("Rating Comparison With All The Apps In the AppStore"),
  sidebarPanel(
    numericInput('clusters', 'Ratings', 4,
                  min = 1, max = 5),
    numericInput('clusters', 'Total', 50000,
                  min = 0, max = 100000)
  ),
  mainPanel(plotOutput('plot'))
)
server <- function(input, output){</pre>
  clusters <- reactive({</pre>
    kmeans(googleplaystore$Rating, centers = 3)
  })
  output$plot <- renderPlot({</pre>
    plot(googleplaystore$Rating,
         col = clusters()$cluster,
         pch = 20, cex = 3)
  })
}
shinyApp(ui, server)
```

Shiny applications not supported in static R Markdown documents

• In the code above, I used r shiny to create a web application that displays the relationship of app ratings with other apps. I made two user interfaces where the user can change the rating and the amount of apps to see the interaction between the two variables.