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Date: 05-17-2020 Honor Statement:

Group Name: Manipogo

# **Individual Milestone 7**

**Topic: Video Games** 

"An electronic game that involves interaction with a user interface to generate visual feedback on a video device such as a TV screen or computer monitor."

The video games space is a 70-year old industry that has rapidly reached across the entire globe with its influence. Video games have evolved over time to incorporate new and advancing technology. Now, incorporated with the internet, they connect people in their homes from all over the world. The video games industry has swelled to reach over 2.5 billion gamers around the world and took in \$131 billion in 2018, with projections of \$300 billion by 2025. Video games have engaged a massive, growing audience so I have decided as a team to try and gain insight into the trends in the sales of video game titles over time. Companies spend millions of dollars and thousands of hours of work on some games but it doesn't always generate enough revenue to even pay off these expenses. If the company is not big enough, they might even go bankrupt after an unsuccessful game release. One of the biggest indications of the revenue generated by the games is the number of sales.

Using the Video Games Sales data I hope to identify trends and predict the sales in different regions as well as overall sales globally. I have decided to split the data into different rows to show individual predictions of the sales in the different regions such as NA, EU, JP, OTHER SALES, GLOBAL SALES. I believe that some games will sell more than others in different regions because some cultures might prefer some genres over others or some platforms are sold more in one region. I believe people also tend to buy more from local publishers/developers. Because of this reason each member of our group will take one region. I have taken EU\_sales that is European region sales

I will use the same explanatory variables to analyze our data within my respected region. The variables consist of critic ratings, user ratings, critic score, user score, year of release, and

platform. I hope that these variables will provide sufficient data in my study in order to show a relevant analysis on video game sales.

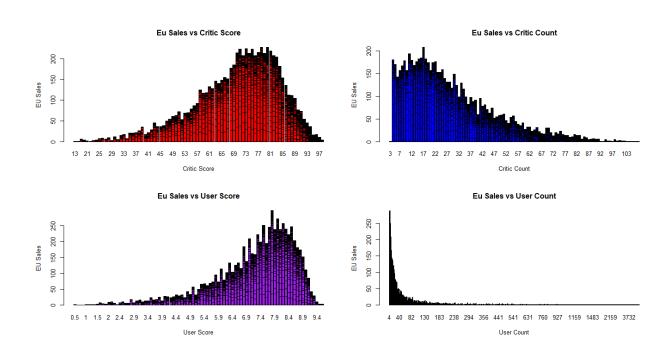
To be able to explore the number of sales a game gets, we will use the data we found on <a href="https://www.kaggle.com/kendallgillies/video-game-sales-and-ratings">https://www.kaggle.com/kendallgillies/video-game-sales-and-ratings</a>. This dataset contains video games that were released between 1976 and 2017 which sold more than 100,000 copies. The author of this dataset created it mostly using VGChartz and Metacritic. It has 7112 observations and 15 variables. The original data had 17,417 observations, but since not all of the listed video games have information on Metacritic's website we removed the rows with missing values. I also dropped rows when there are missing values in any of the variables. For example, if one game is missing a Critic Score (or Platform information, or genre, etc.), I dropped that row.

The explanatory variables (column section) will consist of the platform, year of release, genre, critic score, critic count, user score, user count, publisher, and the rating. The Eu\_sales will be the response variable. The game itself will be rows which are the observations.

Plotted a bar plot for the genre clearly shows that there are a lot more games available in some genres than others, such as there are more than twice the amount of games with Action genre than games with Role-Playing, and the amount of games with Role-Playing tag is more than twice of the ones with Strategy. That might be because some games sell a lot more than the others, thus companies make more of one genre than the other. Also you can see that some games with certain genres get sold less even though there are more games available. E.g. Adventure, Strategy. Similarly, there are a lot more games available to some platform than the others. And this gap might even get bigger if we combine some platforms together such as PS2 and PS3. Also probably the games that are only available to certain platforms affect the sales.

Similarly plotted scatter plot comparing the global sales with the four of the listed regions in the dataset to figure out the linear relationship between them.JP sales is more broadly scattered when compared to others. This tells that in Japan the market share for video games is more when compared to other regions. When compared the year of release with the regional sales the Japan has more number of video games released.In EU region the number of video games usage increased after 2005 and peaked in 2009.

User ratings for Education- with Sports Genre are more widely used, Teenagers prefer Action and Racing genre. Ratings with M and E10+ were also given to few genres, which were almost the same. Plotted individual barplots to compare the EU sales with critic score, critic count, user score and user count. Critic score and user score are negatively skewed, which directly help in spike in EU sales in that region, whereas critic count and user count are positively skewed which did not make any profit in EU sales.



Performed a multiple linear Regression test on the dataset and the response variable wa EU\_Sales . Compare with all the explanatory variables do get the desired adjusted R square for the model. For this I have reduced the from 11 variables to 9 variables to get the regression model. The adjusted R square for this model was one. F test looks good. This tells that at least 1 beta is not equal to zero|| 99% of variability global sales is explained by the model. Null Hypothesis is rejected and the alternative is accepted. test looks good- The beta associated with global\_sales is equal zero, we can reject that and accept the alternative, that it the beta is not equal to zero and use that estimation

Before taking the second order term and the interaction term, we performed the correlation test on the model and found that user score and critic score would be helpful in finding out the second order term and the interaction term in the model. While performing the regression model with the second order term the The adjusted R square for this model was one. F test looks good. This tells that at least 1 beta is not equal to zero || 99% of variability global sales is explained by the model. Null Hypothesis is rejected and the

alternative is accepted. t-test looks good- The beta associated with global\_sales is equal zero, we can reject that and accept the alternative, that the beta is not equal to zero and use that estimation. When using the interaction term for the model, there was no change in the adjusted R square, so removed the interaction term from the model.

Performed Pseudo Random Number Generators for the model, I set the seed and generated a random number, this is to reproduce our experiments. Built a model for test and train dataset, model is built entirely on trained dataset, but is evaluated on the test data. Removed a few variables from the dataset like X,name and platform columns. Approximately 80% of these are 1's and aprroximately 20% of these are 2's.I will use this list to create training and test sets when it is true I will accept it into training data and when it is false I will reject it into my training data. For the test we will get just the opposite of the train set. Training dataset has 5685 observations with 9 variables. the test dataset has 1427 observations with 9 variables. Performed the prediction and actual test on the test and trained the dataset correlation between the actual and predicted value of EU\_Sales. Plotted a linear graph between the prediction and actual values after performing the correlation.

Performed K-fold cross validation to do that we have to use the DAAG package, Performed 3 fold cross validations, for which the results are and average mean square error is 1.46

Results for first fold Sum of squares = 0.09 Mean square = 0 n = 2370

Results for second fold Sum of squares = 0.08 Mean square = 0 n = 2371

Results for third fold

Sum of squares = 10362 Mean square = 4.37 n = 2371

Lastly performed the backward and forward elimination and compared the initial model with the final model to get the result and can remove the low values if its not giving any change in the values. And created a summary of the empty list which has only y intercepts.

My next goal for the milestone 8 is to perform the multicollinearity for the model and identify the regression pitfalls, variable transformation and do residual analysis.

### R Script of the individual milestone

> Videogames <- read.csv("C:/Users/spand/Downloads/video\_without\_na2.csv")

# > str(Videogames) # gives the number of observations and the variables along with category type

'data.frame': 7112 obs. of 15 variables:

\$ X : int 1 3 4 7 8 9 12 14 15 16 ...

\$ Name : Factor w/ 4524 levels ".hack//Infection Part 1",..: 4345 2125 4347 2607

4343 2610 2124 4337 1885 4338 ...

\$ Platform : Factor w/ 17 levels "3DS", "DC", "DS", ...: 13 13 13 13 13 13 13 13 13 13 ...

\$ Year\_of\_Release: int 2006 2008 2009 2006 2006 2009 2005 2007 2010 2009 ...

\$ Genre : Factor w/ 12 levels "Action", "Adventure", ...: 11 7 11 5 4 5 7 11 4 11 ...

\$ NA\_Sales : num 41.4 15.7 15.6 11.3 14 ...

\$ EU\_Sales : num 28.96 12.8 10.95 9.15 9.18 ...

\$ JP\_Sales : num 3.77 3.79 3.28 6.5 2.93 4.7 4.13 3.6 0.24 2.53 ...

\$ Other\_Sales : num 8.45 3.29 2.95 2.88 2.84 2.25 1.9 2.15 1.69 1.77 ...

\$ Global\_Sales : num 82.5 35.6 32.8 29.8 28.9 ...

\$ Critic\_Score : int 76 82 80 89 58 87 91 80 61 80 ...

\$ Critic\_Count : int 51 73 73 65 41 80 64 63 45 33 ...

\$ User\_Score : num 8 8.3 8 8.5 6.6 8.4 8.6 7.7 6.3 7.4 ...

\$ User Count : int 324 712 193 433 129 595 465 146 106 52 ...

\$ Rating : Factor w/ 7 levels "AO", "E", "E10+",..: 2 2 2 2 2 2 2 2 2 2 ...

>

# > summary(Videogames) # gives the min and maximum value of the dataset for each column

X Name

Min.: 1 Madden NFL 07 : 9

1st Qu.: 2771 LEGO Star Wars II: The Original Trilogy: 8

Median: 6112 Madden NFL 08 : 8

Mean : 6803 Need for Speed: Most Wanted : 8
3rd Qu.:10308 Harry Potter and the Goblet of Fire : 7

Max. :17408 Harry Potter and the Order of the Phoenix: 7

(Other) :7065

Platform Year\_of\_Release Genre

PS2 :1169 Min. :1985 Action :1698

X360 : 888 1st Qu.:2004 Sports : 981

PS3 : 790 Median : 2007 Shooter : 900

PC : 734 Mean :2007 Role-Playing: 739

X : 586 3rd Qu.:2011 Racing : 600

Wii : 493 Max. :2016 Platform : 412

(Other):2452 (Other) :1782

NA\_Sales EU\_Sales JP\_Sales Other\_Sales

Min.: 0.0 Min.: 0.00 Min.: 0.00 Min.: 0.00

1st Qu.: 0.1 1st Qu.: 0.02 1st Qu.: 0.00 1st Qu.: 0.01

Median: 0.2 Median: 0.06 Median: 0.00 Median: 0.02

Mean: 0.4 Mean: 0.23 Mean: 0.06 Mean: 0.08

3rd Qu.: 0.4 3rd Qu.: 0.20 3rd Qu.: 0.01 3rd Qu.: 0.07

Max. :41.4 Max. :28.96 Max. :6.50 Max. :10.57

Global\_Sales Critic\_Score Critic\_Count User\_Score

Min.: 0.0 Min.: 13.0 Min.: 3.0 Min.: 0.50

1st Qu.: 0.1 1st Qu.:62.0 1st Qu.: 14.0 1st Qu.:6.50

Median: 0.3 Median: 72.0 Median: 24.0 Median: 7.50

Mean: 0.8 Mean: 70.2 Mean: 28.7 Mean: 7.18

3rd Qu.: 0.7 3rd Qu.:80.0 3rd Qu.: 39.0 3rd Qu.:8.20

Max. :82.5 Max. :98.0 Max. :113.0 Max. :9.60

User Count Rating

Min.: 4 AO: 1

1st Qu.: 11 E :2162

Median: 27 E10+: 968

Mean: 175 K-A: 1

3rd Qu.: 88 M :1489

Max. :10766 RP: 2

T:2489

>

>											
> head(Videogames) # gives the data of the first 6 columns											
X Name Platform Year_of_Release Genre											
1 1	Wii Sports Wii 2006 S										
23		Mario Kart Wii Wii 2008 Racing									
3 4	V	Wii Sports Resort Wii 2009 Sports									
47	New	/ Super	Mario I	Bros.	DS		2006 P	Platform			
58		Wii	Play	Wii	2	2006	Misc				
6 9 New Super Mario Bros. Wii Wii 2009 Platform											
NA_Sales EU_Sales JP_Sales Other_Sales Global_Sales											
1	41.4	28.96	3.77	8	.45	82.5					
2	15.7	12.80	3.79	3	.29	35.6					
3	15.6	10.95	3.28	2	.95	32.8					
4	11.3	9.15	6.50	2.	88	29.8					
5	14.0	9.18	2.93	2.	84	28.9					
6	14.5	6.95	4.70	2.	25	28.4					
Critic_Score Critic_Count User_Score User_Count Rating											
1	76	5 5	51	8.0	324	Е					
2	82	2	73	8.3	712	Е					
3	80	) 7	73	8.0	193	Е					
4	89	) (	65	8.5	433	Е					
5	58	} 4	11	6.6	129	Е					
6	87	7 8	30	8.4	595	Е					
> tail(Videogames) # gives the data of the last 6 columns											
X Name Platform											
7107 17384 Nancy Drew: The Phantom of Venice PC											
7108 17395 Tom Clancys Splinter Cell PC											
7109 17402 Blacksite: Area 51 PC											
7110 17403 Virtua Tennis 2009 PC											
7111 17405 CivCity: Rome PC											
7112 17408 Super Meat Boy PS4											

Year\_of\_Release Genre NA\_Sales EU\_Sales JP\_Sales

0

0

7107 2008 Adventure 0

```
7108
           2003 Action
                            0
                                  0
                                       0
7109
           2007 Shooter
                             0
                                  0
                                        0
                                  0
7110
           2009 Sports
                            0
                                       0
7111
           2006 Strategy
                             0
                                  0
                                        0
7112
           2016 Platform
                             0
                                  0
                                        0
  Other_Sales Global_Sales Critic_Score Critic_Count
7107
          0
                 0.01
                           69
                                    7
7108
          0
                 0.01
                           91
                                   20
7109
                 0.01
                                   20
          0
                           60
7110
                 0.01
                           68
                                    8
          0
7111
                           67
                                   46
          0
                 0.01
7112
          0
                 0.01
                           85
                                    7
  User_Score User_Count Rating
7107
                 8
                      Ε
         6.6
7108
         8.5
                291
                      Τ
7109
         4.9
                 42
                      Т
                      Ε
7110
         6.5
                 19
```

>

# > dim(Videogames) # gives the exact dimensions of the data

[1] 7112 15

6.9

7.0

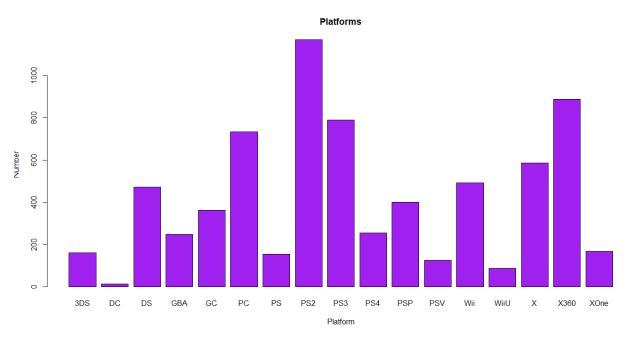
>

# > # Plot a graph between numbers and platform graph

32 E10+

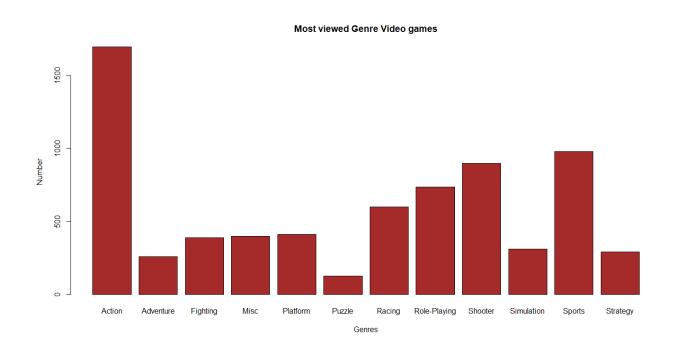
Т

> plot(Videogames[, 3], xlab="Platform", ylab= "Number", main = "Platforms", col= "purple")



# > # Graph of Genres

> plot(Videogames[, 5], xlab="Genres", ylab= "Number", main = "Most viewed Genre Video games", col= "brown")



# # Installing Packages

```
install.packages('ggplot')
```

library(ggplot)

install.packages('readr')

library(readr)

install.packages('dplyr')

library(dplyr)

install.packages('ggplot2')

library(ggplot2)

install.packages('scales')

library(scales)

# # A scatter plot to compare the global sales with the remaining sales variables present in the dataset

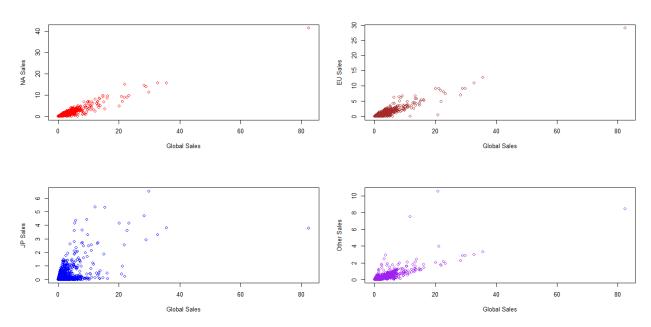
par(mfrow = c(2,2))

plot(Videogames\$Global\_Sales, Videogames\$NA\_Sales, xlab ="Global Sales", ylab = "NA Sales", col = 'red')

plot(Videogames\$Global\_Sales, Videogames\$EU\_Sales, xlab ="Global Sales", ylab = "EU Sales", , col = 'brown')

plot(Videogames\$Global\_Sales,Videogames\$JP\_Sales, xlab ="Global Sales", ylab = "JP Sales", col = 'blue')

plot(Videogames\$Global\_Sales, Videogames\$Other\_Sales, xlab = "Global Sales", ylab = "Other Sales", col = 'purple')



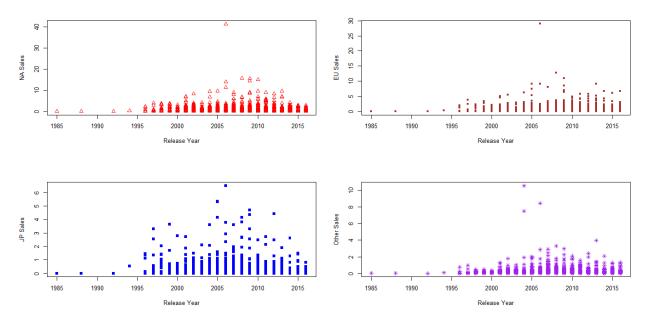
# A scatter plot with year of release with respective sales of the regions par(mfrow = c(2,2))

plot(Videogames\$Year\_of\_Release,Videogames\$NA\_Sales, xlab ="Release Year", ylab = "NA Sales", col = 'red', pch= 2)

plot(Videogames\$Year\_of\_Release,Videogames\$EU\_Sales, xlab ="Release Year", ylab = "EU Sales", , col = 'brown', pch= 20, lwd= 2)

plot(Videogames\$Year\_of\_Release,Videogames\$JP\_Sales, xlab ="Release Year", ylab = "JP Sales", col = 'blue', pch= 15)

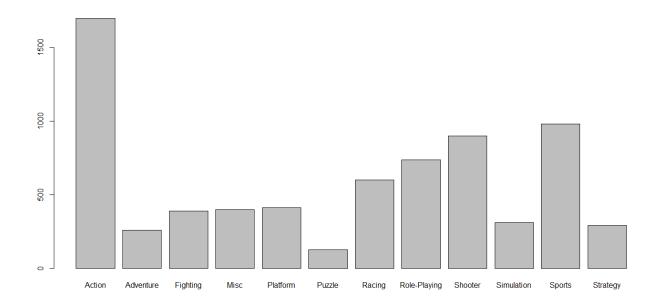
plot(Videogames\$Year\_of\_Release,Videogames\$Other\_Sales, xlab ="Release Year", ylab = "Other Sales", col = 'purple', pch= 8)



# A barplot to show the number of Genres of games played from 1985 to 2015

par(mfrow = c(1,1))
plot(Videogames\$NA\_Sales~ Videogames\$Genre)

table(Videogames\$Genre)
barplot(table(Videogames\$Genre))



# **#Videogames\$Rating**

```
EEEEEEEE
[1] E
                             M
                                M
[13] E
           Ε
              Ε
                          M
                             M
                               M
         M
                M
                   M
                      M
           ΜЕ
                   E E
                         M
                            Ε
                               Ε
                                 Ε
[25] M
      Ε
        Т
                 M
           E10+ E M M
                        Т
                           T E10+ M
[37] M
      M
        M
                                     M
[49] E
      Ε
        Е
           M
              E M E E
                         Ε
                           Т
                              T T
                 M M T
[61] E
      M
        M
           Ε
              M
                          Ε
                            Ε
                               E10+ M
[73] T
     Т
        Ε
           T E T E10+ M
                          Τ
                            M
                               T E
     E E M M M E E M
[85] M
                            M
[97] T
     M E10+M E M M M T M E
                               Ε
[109] M E10+T M T E10+E
                         M
                            M
[121] T E E
           M
              Ε
                Т
                   Т
                      M
                         Ε
                            M
                               Τ
                                  M
      Ε
            Ε
              Ε
                 M
                               Ε
                                  Ε
[133] M
        Т
                    Τ
                       Т
                         M
                            M
         Τ
            Т
              Τ
                    Τ
                       Ε
                         Τ
                               M
                                  Т
[145] M
      M
                 M
                            M
[157] E E
        Т
           \mathsf{T} \mathsf{T} \mathsf{T}
                   Τ
                      Ε
                         Ε
                           Т
                              Ε
[169] E E10+E T E E E M E10+T E
         E10+ M E10+ M
                      ΤE
                            M
                               Ε
[181] M
                                  M
                                    E10+
[193] E
      Ε
         M E T
                 Ε
                    M
                       M
                          M
                            Τ
                               M
                                  M
                       M M E10+ E10+ M
[205] M
      ΜЕ
            Ε
              Т
                 M
                    M
[217] T E E10+ T
               Т
                 Т
                    E E10+ M E E E10+
         M
            Ε
              Ε
                 Ε
                   Т
                      E E10+ M
                                Ε
[229] T
     Ε
[241] M
     Ε
        Τ
            M
               Т
                 Τ
                    Ε
                      Τ
                        E M M M
            M M M E M T
[253] M T
         Ε
                               M M
[265] E10+ E M M T M M T T E
                                E10+ E
[277] E
     T T M T T E10+ M
                           M
                              M
                                Т
                                  Е
      M = 10 + E = E = T M
[289] E
                             M
                                Т
         EEEEEEMEE
[301] T
      Ε
[313] M
      M
         M
            Т
               Ε
                 T E10+ E10+ M
                               E10+ M
                                      M
[325] M
      Т
         Ε
            Ε
              M
                 M
                    Ε
                      Т
                         Т
                            Ε
                               M
                                  M
[337] T
         Е
            M
               M
                  M
                    Τ
                       Ε
                          Т
                            M
                               Ε
      M
                                  M
[349] E
      Ε
         E10+ E
              Ε
                 E10+ T T
                           M E T M
[361] M
      Ε
         M
            Τ
               M
                  M
                    Τ
                       Ε
                          Τ
                            M
                               E10+ E10+
            M
              E T E
                      M E
[373] M T T
                            M
                               T E
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[385] E10+ M E T E10+ E T T T
[397] E T T T T E E E
                         M
                            Ε
                               M
                                 E10+
[409] E E E10+ E T M E T T
[421] E10+ E E E10+ E E
                      ΤE
                           T M
                                 Ε
[433] E T E M M E T T
                         E10+ T E
[445] E10+ T E E E10+ M E E T E10+ M M
[457] M T E E T E10+ E T E10+ T T E10+
[469] M
      Ε
         Ε
            E T E M T E10+ E E10+ E
        E E E10+M E E E
[481] M T
                             M
                                Ε
[493] E E E10+ M T E E T
                           Ε
                             Τ
                                   M
[505] T T T T E10+ E E M
                            Т
         Ε
           T E10+T E10+E M
                              M
                                  Т
[517] E E
[529] E E
         Ε
           Ε
              E M E T
                         M M
[541] M M M T E E10+ E T E10+ E
                                  E10+ E
[553] E10+ M T T E E10+ M T E10+ E T T
[565] E T T M E10+E T M E T E E10+
[577] E M E10+ M T T M E10+ T M E E10+
[589] E10+ E M E10+ M T M E AO E
[601] E10+ T T E
                 ΤE
                        M
                          M
                             M
[613] M T E K-A T
                 M E
                       Т
                          M
                             Ε
            Ε
                 Ε
                   T E10+ E
                             Ε
[625] T
     Ε
         M
              Т
[637] E
      Τ
         Т
           Ε
              M
                 Ε
                    Ε
                       E E E10+T
                 T E M
                          Ε
[649] E
      Т
         M
            M
               Ε
                            Ε
                               Ε
                                  Т
              Т
                 E10+ E E10+ T E
[661] T
         Ε
            M
                                  Ε
                                    M
      M
[673] M
      M
         Τ
           Т
               Τ
                 M T E M E10+ T
         Τ
               Τ
                 E10+ E E E M
[685] M
      Т
            M
                                Ε
                                   Т
                 E M E10+ M E
[697] M
      M
         Τ
            Τ
               Ε
                 E10+ M T T
           Τ
[709] E
      Ε
         Ε
              M
                             Ε
                                Ε
[721] E E
        Т
           \mathsf{E} \mathsf{M} \mathsf{T} \mathsf{E}
                      T E E10+ E
[733] E E10+ E M E M T E10+ E T E10+ T
[745] E
     M E M E M E E M E
                               M
[757] E E10+ E E T E10+ E E E M
[769] M E E M M T E E E10+E10+T E
```

```
[781] E E M M M E
                       E E10+ M T E
[793] E10+ T T E E E10+ T
                              M M
                                     Ε
[805] T M T T
                  T M
                         M
                            Ε
                               Т
                Ε
                         Ε
                            Ε
[817] E M E
             M
                Т
                   T E
                               M
                                  Т
                                     Т
[829] E E10+ T T
                EMET
                            Τ
                                Т
             T M E T E E10+T T M
[841] M M E
[853] T E10+ T E10+ E T E T M M E
[865] E M
         M
             M E10+ E E E T E E
                                      Т
[877] E E M E M T E E M M M E10+
                M M E E E T M E10+
[889] T E10+ E E
[901] M E T E10+ E M E10+ E E E
                E M E T E10+ E10+ M
[913] M T
          M
             M
                                        M
            M M
                   ΕТ
                         Т
[925] T T M
                            Ε
                               M M
[937] T E
          Т
             M E
                   Е
                      E10+ T T
                                Ε
                                  Ε
[949] M T
          M
             M E10+ T M E
                             T E10+ E10+ T
                             M
[961] M T
          Ε
            T T E10+ T
                          Ε
                                M
                                   M T
             E E10+ E E
[973] M T T
                          M
                             Ε
                                M
                                    E10+ M
[985] M E10+T T E T M
                          Τ
                             Ε
                                Е
                                   E10+ E
[997] M E E E
[ reached getOption("max.print") -- omitted 6112 entries ]
Levels: AO E E10+ K-A M RP T
> Genre_Rating_Edu <- table(Videogames$Genre[Videogames$Rating == 'E'])
> Genre_Rating_Edu
         Adventure
  Action
                   Fighting
                             Misc
                                  Platform
                         167
    199
            51
                   6
                                246
  Puzzle
          Racing Role-Playing
                            Shooter Simulation
    95
           359
                   74
                         25
                                109
  Sports
         Strategy
    785
            46
> #-----
> Genre_Rating_Teen <- table(Videogames$Genre[Videogames$Rating == 'T'])
```

# > Genre\_Rating\_Teen

```
Adventure
                       Fighting
                                           Platform
   Action
                                    Misc
     604
               85
                       326
                                138
                                          58
   Puzzle
             Racing Role-Playing
                                    Shooter Simulation
      7
             141
                      403
                               298
                                         168
   Sports
            Strategy
     110
              151
> #----
> Genre_Rating_Middle <- table(Videogames$Genre[Videogames$Rating == 'M'])
> Genre_Rating_Middle
```

> #---

> Genre\_Rating\_E10 <- table(Videogames\$Genre[Videogames\$Rating == 'E10+'])

> Genre\_Rating\_E10

Action	Adventure	Fightin	ng	Misc	Platform
315	34	14	82	105	;
Puzzle	Racing Role-Playing			Shooter	Simulation
25	82	103	34	30	
Sports	Strategy				
75	69				

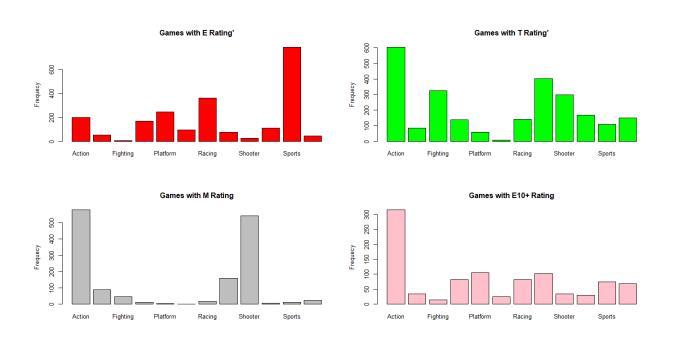
# #Individual games with specific rating graphs

```
par(mfrow = c(2,2))
barplot(Genre_Rating_Edu, ylab= "Frequecy", main = "Games with E Rating'", col= 'red')
```

barplot(Genre\_Rating\_Teen, ylab= "Frequecy", main = "Games with T Rating'", col= 'Green')

barplot(Genre\_Rating\_Middle, ylab= "Frequecy", main = "Games with M Rating", col= 'Grey')

barplot(Genre\_Rating\_E10, ylab= "Frequecy", main = "Games with E10+ Rating", col= 'Pink')



> table(Videogames\$EU\_Sales, Videogames\$Critic\_Score)

0.09 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 1 0 0 1 0.1 0 0 0 0 0 0 0 0 0 0 0 0 1 0 0 0 0 0.11 0 0 0 0 0 0 0 0 0 0 0 0 1 0 1 0 0 0

36 37 38 39 40 41 42 43 44 45 46 47 48 49 50 51 52 53 54
0 5 11 7 12 3 7 8 11 7 13 13 10 13 16 14 15 8 9 9
0.01 4 2 5 5 4 3 5 1 6 5 8 6 11 8 6 10 8 12 9
0.02 4 5 3 3 1 0 2 4 4 6 4 7 2 6 5 7 7 11 10
0.03 1 2 0 1 1 1 3 3 4 1 1 4 5 5 11 7 3 8 4
0.04 0 0 1 2 1 1 4 4 2 0 0 3 2 5 5 5 2 2 5
0.05 1 1 0 5 1 0 2 4 1 0 0 1 2 2 2 3 6 5
0.06 1 0 1 0 0 0 1 1 1 2 1 0 2 3 1 1 2 4 4
0.07 1 0 1 1 1 0 0 1 2 0 0 1 2 1 2 3 0 3 3
0.08 1 0 1 1 0 0 0 0 0 2 0 2 1 1 0 1 2 1 2
0.09 1 0 0 3 1 1 0 4 1 1 2 3 1 1 0 3 1 2 0
0.1 0 0 1 0 2 2 0 0 1 0 2 2 0 1 2 2 1 3 1
0.11 0 0 0 0 1 0 0 0 2 1 2 0 1 0 0 0 0 0

55 56 57 58 59 60 61 62 63 64 65 66 67 68 69 70 71 72 73
0 14 21 16 22 20 18 26 23 37 27 22 23 32 27 28 34 38 22 29
0.01 9 18 14 14 11 18 17 18 16 17 18 29 17 23 22 21 29 24 17
0.02 15 8 9 18 13 10 8 18 16 18 14 17 17 15 22 22 17 24 25
0.03 5 5 7 9 10 13 8 11 13 11 14 11 14 12 14 15 14 16 15
0.04 1 3 6 9 8 9 11 7 6 11 7 13 13 8 11 13 14 8 10
0.05 3 1 5 9 4 2 11 3 6 3 10 6 6 7 6 7 9 9 7
0.06 1 3 0 4 2 3 4 3 0 6 6 5 3 8 4 8 7 10 5
0.07 0 2 5 4 4 4 5 3 4 3 5 5 2 6 6 1 5 8 9
0.08 1 3 5 3 4 3 4 1 3 1 4 2 3 4 9 6 4 6 3
0.09 3 2 1 6 2 3 6 4 4 2 2 3 0 6 7 3 2 3 7
0.1 1 4 1 5 3 1 3 1 0 2 3 3 6 3 3 5 6 2 5
0.11 1 1 2 3 1 3 2 1 3 3 1 6 4 3 4 6 6 4 3

74 75 76 77 78 79 80 81 82 83 84 85 86 87 88 89 90 91 92

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18 30 20 28 30 26 24 22 28 20 9 10 5 4 2 5 4 4 2
 0.01 16 27 11 16 13 14 19 15 19 14 11 8 7 3 4 2 1 3 2
 0.02 25 25 17 14 26 16 17 14 14 13 12 11 6 6 3 7 9 1 5
 0.03 18 16 18 13 15 16 12 10 12 14 9 5 8 5 3 7 4 3 1
 0.04 6 13 14 14 16 16 9 9 11 10 5 10 5 5 6 5 3 1 1
 0.05 6 12 8 10 10 10 6 14 5 9 4 4 4 3 2 3 3 2 0
 0.06 12 5 7 9 5 6 6 4 8 9 3 4 6 3 3 3 2 1 1
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 0.08 4 2 6 4 3 4 6 8 4 4 6 5 4 2 1 3 0 4 3
 0.09 6 5 5 7 2 4 4 3 1 3 1 3 4 0 8 1 2 1 4
 0.1 6 5 2 7 4 2 4 5 4 4 4 3 1 5 2 0 0 1 0
 0.11 6 3 8 8 6 1 4 4 7 2 2 1 3 1 1 2 3 0 0
    93 94 95 96 97 98
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 0.03 1 1 0 0 0 0
 0.04 2 0 0 0 0 0
 0.05 0 0 0 0 1 0
 0.06 0 0 0 0 0 0
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 0.09 1 1 0 0 0 0
 0.1 2 1 0 0 0 0
 0.11 0 0 0 1 0 0
[ reached getOption("max.print") -- omitted 260 rows ]
> EUSales_Criticscore <- table(Videogames$EU_Sales, Videogames$Critic_Score)
>
> par(mfrow = c(1,1))
> barplot(EUSales_Criticscore, xlab = 'Critic Score', ylab= 'EU Sales')
>
>
```

> table(Videogames\$EU\_Sales, Videogames\$Critic\_Count)

3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21
0 0 55 43 36 45 39 51 25 48 36 35 28 37 29 39 26 35 28 18
0.01 0 26 19 24 20 26 21 19 19 23 25 16 24 26 20 21 20 17 22
0.02 0 21 21 11 11 13 18 14 27 19 17 21 19 22 26 19 18 16 18
0.03 0 9 13 9 15 13 14 16 15 15 8 17 10 15 20 9 13 13 10
0.04 0 11 12 6 6 8 12 11 17 16 10 10 11 10 19 10 7 11 12
0.05 0 12 10 7 3 9 8 4 5 7 5 9 11 8 5 10 8 8 7
0.06 0 4 6 4 4 5 1 8 5 6 4 5 6 2 8 9 2 7 4
0.07 0 1 5 3 3 4 2 4 9 3 4 4 6 6 7 7 7 2 6
0.08 0 2 4 1 4 3 3 5 2 4 6 6 4 5 6 5 4 7 5

22 23 24 25 26 27 28 29 30 31 32 33 34 35 36 37 38 39 40
0 24 24 27 31 22 19 13 24 24 10 9 18 12 11 10 10 8 1 2
0.01 24 22 21 17 14 15 9 10 15 14 10 12 16 11 9 10 6 7 5
0.02 16 14 15 15 15 11 18 13 14 10 11 8 9 10 7 7 13 9 8
0.03 13 10 9 19 12 13 7 9 8 16 5 10 8 7 7 8 5 8 4
0.04 9 7 8 9 6 12 9 1 5 10 6 3 6 2 6 5 3 6 7
0.05 11 6 2 4 11 5 4 1 6 6 3 3 5 3 0 4 1 4 4
0.06 10 5 3 5 1 3 3 6 4 5 4 9 2 5 1 3 3 3 4
0.07 5 3 5 4 3 6 5 5 4 6 4 7 3 4 3 4 0 3 1
0.08 3 2 4 4 4 5 3 3 2 4 3 3 3 2 2 4 2 1 2

41 42 43 44 45 46 47 48 49 50 51 52 53 54 55 56 57 58 59
0 11 2 4 6 6 3 0 5 4 0 3 1 2 1 4 0 3 0 0
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0.02 6 8 3 7 1 11 4 2 7 2 4 8 1 5 4 2 3 5 2
0.03 7 3 2 6 2 7 3 2 1 3 6 4 0 3 3 2 4 1 2
0.04 2 0 6 6 3 4 2 3 2 2 5 1 1 3 3 2 1 0 2
0.05 5 2 4 4 2 1 2 5 1 4 3 1 2 2 3 1 1 1 2
0.06 2 5 6 3 3 4 3 1 1 0 0 1 1 2 2 0 1 0 1

0.07 2 3 2 1 0 0 1 1 4 5 0 2 2 3 2 2 0 0 0 0 0.08 2 2 3 3 1 2 0 2 1 0 2 1 0 2 1 1 0 1 0

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0.07 0 0 0 0 0 0 0 0 0 0
0.08 \ 0 \ 0 \ 0 \ 0 \ 0 \ 0 \ 0 \ 0 \ 0
[ reached getOption("max.print") -- omitted 263 rows ]
> EUSales Criticcount <- table(Videogames$EU Sales, Videogames$Critic Count)
> barplot(EUSales_Criticcount, xlab = 'Critic Count', ylab= 'EU Sales')
>
>
>
> table(Videogames$EU_Sales, Videogames$User_Score)
   0.5 0.6 0.7 0.9 1 1.2 1.3 1.4 1.5 1.7 1.8 1.9 2 2.1 2.2
0
     1 1 1 1 0 0 1 1 0 3 2 1 3 2 3
     0 0 0 0 2 0 1 0 2 0 2 0 1 1 0
0.02 1 0 0 0 0 1 0 1 0 1 0 0 0 1 2
0.03
     0 0 0 0 0 0 0 0 1 0 0 1 0 0
0.04
     0 0 0 0 0 0 0 0 0 0 0 0 1 1 0
0.05
     0 0 0 0 0 0 0 0 0 0 1 1 0 0
0.06
     0 0 0 0 0 1 0 0 0 0 0 0 0 0
0.07
     0 0 0 0 0 0 0 0 1 0 0 0 1 0
0.08
     0 0 0 0 0 0 0 0 1 0 0 0 1
0.09 0 0 0 0 0 0 0 0 0 0 0 0 0
0.1
     2.3 2.4 2.5 2.6 2.7 2.8 2.9 3 3.1 3.2 3.3 3.4 3.5 3.6
     2 2 3 2 2 6 2 3 7 2 3 1 7 5
0.01 0 1 3 0 1 5 0 3 1 0 0 2 3 1
0.02 0 1 1 1 1 3 2 0 1 1 0 1 1 1
0.03
     0 0 2 0 0 2 0 1 2 1 1 0 3 0
0.04
     0 0 0 0 0 1 0 1 0 1 0 1 0 0
0.05
     0 0 0 0 1 0 0 0 1 0 1 0 4 1
0.06
     0 0 0 0 0 0 1 0 0 1 0 2 2 0
0.07
     0 1 0 0 0 0 1 1 0 0 0 0 0
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0.08 0 2 0 0 0 0 0 1 0 0 2 0 0 0

0.09 0 0 0 0 0 0 1 0 0 0 2 0 1 0.1 0 0 0 0 0 0 1

3.7 3.8 3.9 4 4.1 4.2 4.3 4.4 4.5 4.6 4.7 4.8 4.9 5 5.1 3 4 2 7 3 7 2 6 11 6 4 11 7 4 7 0.01 2 1 0 5 2 3 3 2 2 6 3 6 3 7 2 0.02 2 3 1 0 5 1 2 2 4 4 3 2 2 8 2 0.03 1 1 3 2 3 1 0 1 2 0 1 2 2 9 2 0.04 1 4 0 3 1 2 3 1 0 1 1 2 2 5 1 0.05 1 5 0 2 1 1 0 3 1 0 1 0 1 2 3 0.06 0 0 1 1 1 0 0 3 1 0 0 2 1 3 1 0.07 1 0 0 1 0 1 1 1 1 1 1 2 0 1 0 0.08 0 1 0 1 2 0 0 2 0 0 2 2 0 2 0 0.09 1 0 1 0 0 0 2 1 0 0 1 2 1 2 0 0.1 0 0 0 0 0 0 1 2 1 1 0 2 1 0 0

5.2 5.3 5.4 5.5 5.6 5.7 5.8 5.9 6 6.1 6.2 6.3 6.4 6.5 6 17 14 10 15 7 20 2 21 16 15 26 14 25 0.01 7 10 6 7 12 12 8 10 10 9 16 10 9 11 0.02 5 5 11 2 3 6 10 9 10 4 10 14 10 10 0.03 3 2 3 5 6 1 9 6 8 2 8 9 6 10 0.04 1 4 4 2 4 2 2 3 7 4 3 9 9 8 0.05 2 3 1 4 2 2 6 1 4 4 8 2 2 4 0.06 1 2 1 1 3 3 1 1 5 4 2 3 3 4 0.07 1 2 0 1 3 1 1 2 5 2 1 3 3 4 80.0 4 1 0 0 0 3 0 4 2 1 2 1 2 0 0.09 0 1 0 1 0 2 2 5 5 1 5 2 6 2 0.1 2 1 2 2 1 1 3 2 3 1 0 2 2 3

6.6 6.7 6.8 6.9 7 7.1 7.2 7.3 7.4 7.5 7.6 7.7 7.8 7.9 8
0 18 18 27 16 43 24 19 48 34 34 24 42 35 36 41
0.01 10 11 21 15 22 19 16 21 18 29 18 21 41 15 29
0.02 10 17 19 9 21 11 12 21 18 24 24 19 26 27 26

0.03 10 6 16 2 14 8 21 17 9 22 13 14 21 11 12 0.04 7 3 10 2 8 11 7 13 9 11 7 12 18 10 15 0.05 4 4 6 5 10 7 4 8 7 9 4 8 13 7 12 0.06 7 2 4 8 4 5 2 4 7 6 6 5 9 8 8 0.07 5 2 7 5 3 4 5 9 6 4 7 7 4 4 10 0.08 2 1 5 0 7 5 4 5 3 7 3 4 7 5 4 0.09 6 1 4 3 9 3 3 2 8 6 4 5 6 1 9 0.1 3 2 4 6 5 3 1 4 6 2 2 2 3 1 3

8.1 8.2 8.3 8.4 8.5 8.6 8.7 8.8 8.9 9 9.1 9.2 9.3 9.4 26 27 28 22 22 16 12 15 7 9 3 2 3 3 0.01 22 22 24 18 18 16 15 18 7 8 3 3 6 0 0.02 19 18 24 23 25 18 20 9 7 11 9 7 4 0 0.03 20 21 17 18 14 15 10 19 12 9 8 2 2 1 0.04 14 22 15 7 14 13 12 11 12 9 6 5 1 0 0.05 9 11 4 11 10 8 11 10 2 3 4 4 1 0 0.06 8 11 6 8 8 6 5 1 5 7 2 2 0 0 0.07 4 4 10 4 8 7 5 7 7 3 3 0 2 0 0.08 5 9 5 4 8 5 4 3 12 2 3 0 2 0 0.09 3 4 4 5 5 3 1 4 4 1 7 0.1 5 5 10 7 8 5 3 4 4 3 0 1 1

9.5 9.6

0 1 1

0.01 0 0

0.02 1 0

0.03 0 0

0.04 0 1

0.05 0 0

0.06 0 0

0.07 0 0

0.08 0 0

0.09 0 0

```
0.1 0 0
[ reached getOption("max.print") -- omitted 261 rows ]
> EUSales_Userscore <- table(Videogames$EU_Sales, Videogames$User_Score)
> barplot(EUSales Userscore, xlab = 'User Score', ylab= 'EU Sales')
>
> table(Videogames$EU_Sales, Videogames$User_Count)
    4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22
 0 89 76 70 50 55 41 30 32 25 24 26 33 29 25 26 18 15 23 11
    23 24 25 26 27 28 29 30 31 32 33 34 35 36 37 38 39 40 41
 0 13 10 17 12 10 7 7 8 11 13 4 10 7 4 10 7 5 2 3
    42 43 44 45 46 47 48 49 50 51 52 53 54 55 56 57 58 59 60
 0 4596154322410203012
    61 62 63 64 65 66 67 68 69 70 71 72 73 74 75 76 77 78 79
   5 1 4 1 2 1 2 1 0 2 1 5 2 2 2 3 1 0 2
    80 81 82 83 84 85 86 87 88 89 90 91 92 93 94 95 96 97 98
   0 1 1 0 0 1 0 4 0 1 1 0 0 0 1 1 2 0 0
    99 100 101 102 103 104 105 106 107 108 109 110 111 112
 0 1 1 0 1 0 0 0 0 1 2 2 0 0 0
    113 114 115 116 117 118 119 120 121 122 123 124 125 126
 0 0 1 0 1 0 1 1 0 1 0 0 1 0 1
    127 128 129 130 131 132 133 134 135 136 137 138 139 140
 0 0 0 1 0 0 1 1 0 0 0 0 1 0 0
```

```
141 142 143 144 145 146 147 148 149 150 151 152 153 154
0 0 1 0 0 0 0 0 1 0 0 0 0 0
  155 156 157 158 159 160 161 162 163 164 165 166 167 168
0 0 0 0 1 0 0 1 0 0 1 0 2 1 0
  169 170 171 172 173 174 175 176 177 178 179 180 181 182
0 000000100001
  183 184 185 186 187 188 189 190 191 192 193 195 196 198
0 0 0 0 0 0 1 0 0 0 0 1 0 0 0
  199 200 201 202 203 204 205 206 207 208 209 210 211 212
0 0 0 0 1 1 0 1 0 0 0 0 0 0
  213 214 215 216 217 218 219 220 221 222 223 224 225 226
0 0 0 0 0 0 0 0 1 0 0 0 0
  227 228 229 230 231 232 233 234 235 236 237 238 239 240
0 0 0 0 0 1 0 0 0 0 0 0 2 0 0
  241 243 244 245 246 247 248 249 250 251 253 255 256 257
0 0 0 0 0 0 0 0 0 0 0 0 1 0
  258 259 260 261 262 263 264 265 266 267 268 269 270 271
0 0 0 0 0 0 0 1 0 0 0 0 0
  272 273 274 275 276 277 278 279 280 281 282 283 284 285
0 00000000000000
  286 287 288 289 290 291 292 293 294 295 296 297 298 299
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0 0 1 0 0 0 1 0 0 0 0 0 0 0

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300 301 303 304 305 307 308 309 310 311 312 313 314 315
316 317 318 319 321 324 325 326 327 328 329 330 331 332
0 0 0 0 0 1 0 0 0 0 0 0 0 0
  333 335 336 337 339 340 341 342 343 345 347 348 349 350
0 00000000000000
  351 352 353 354 355 356 357 358 359 361 362 365 366 367
0 00000000000000
  368 369 371 374 375 376 377 378 381 384 385 386 387 388
390 391 393 395 397 399 400 403 404 405 407 409 410 412
0 0 0 0 0 0 1 0 0 0 0 0 0
  413 415 418 421 423 424 425 429 432 433 434 435 436 438
0 00000000000000
  439 440 441 442 443 444 445 447 450 452 453 455 456 457
0 0 0 0 0 0 0 0 0 0 0 1 0 0
  458 461 462 463 465 467 468 469 470 472 473 479 482 483
487 488 490 491 492 493 494 496 498 503 507 511 512 516
0 00000000000000
  517 518 519 521 524 525 526 530 531 533 534 536 539 541
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542 543 544 545 546 547 548 549 552 553 555 556 557 558
559 561 562 565 566 567 569 570 571 572 573 575 576 580
0 00000000000000
  583 586 587 589 590 595 598 600 603 605 606 607 608 609
0 00000000000000
  610 611 614 619 620 621 623 624 628 629 631 632 633 635
0 00000000000000
  642 645 646 648 654 657 658 660 661 664 666 667 669 670
0 0 0 0 0 0 0 0 1 0 0 0 0
  671 675 681 682 684 685 686 688 695 696 697 698 700 702
0 00000000000000
  706 708 710 712 713 715 716 717 718 719 723 726 730 734
0 00000000000000
  735 736 738 747 752 754 755 760 762 763 769 771 774 775
0 00000000000000
  776 777 778 782 784 787 789 792 798 800 803 808 813 815
818 819 820 823 825 835 842 845 846 848 850 859 865 870
0 00000000000000
  874 877 888 894 895 896 897 900 902 905 907 910 912 914
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965 968 972 977 980 981 982 986 993 994 1000 1007 1008
0 0 1 0 0 0 0 1 0 0 0 0 0
  1010 1017 1025 1031 1034 1035 1036 1046 1049 1059 1062
0 0 0 0 0 0 0 0 0 0 1
  1067 1070 1075 1077 1079 1083 1084 1087 1095 1096 1100
0 0 0 0 0 0 0 0 0 0 0
  1101 1104 1111 1112 1113 1115 1123 1124 1130 1136 1137
0 0 0 0 0 0 0 0 0 0 0
  1139 1142 1158 1159 1162 1166 1173 1176 1177 1185 1187
0 0 0 0 0 0 0 0 0 0 0
  1189 1194 1199 1200 1204 1208 1212 1219 1224 1226 1228
0 0 0 0 0 0 0 0 0 0 0
  1232 1233 1240 1242 1243 1253 1258 1259 1263 1270 1272
0 0 0 0 0 0 0 0 0 0 0
  1289 1292 1297 1300 1302 1304 1309 1314 1318 1320 1322
0 0 0 0 0 0 0 0 0 0 0
  1327 1333 1341 1350 1353 1369 1386 1408 1409 1410 1412
0 0 0 0 0 0 0 0 0 0 0
  1417 1434 1440 1446 1451 1456 1472 1474 1475 1476 1477
0 0 0 0 0 0 0 0 0 0 0
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916 918 921 925 927 934 935 937 938 943 945 948 956 957

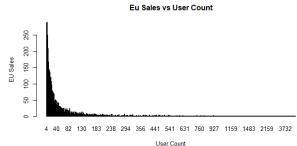
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1478 1482 1483 1500 1502 1505 1509 1510 1512 1525 1538
0 0 0 0 0 0 0 0 0 0 0
  1552 1553 1562 1570 1579 1586 1603 1604 1606 1607 1615
0 0 0 0 0 0 0 0 0 0 0
  1621 1625 1639 1652 1657 1658 1659 1662 1663 1664 1667
0 0 0 0 0 0 0 0 0 0 0
  1675 1679 1682 1702 1715 1733 1736 1747 1749 1759 1762
0 0 0 0 0 0 0 0 0 0 0
  1855 1859 1861 1862 1864 1868 1874 1890 1907 1972 1979
0 0 0 0 1 0 0 0 0 0 0
  1982 1983 1988 2005 2053 2069 2075 2077 2094 2113 2118
0 0 0 0 0 0 0 0 0 0 0
  2144 2159 2174 2197 2199 2200 2210 2234 2241 2256 2261
0 0 0 0 0 0 0 0 0 0 0
  2298 2301 2312 2327 2328 2332 2376 2382 2411 2427 2429
0 0 0 0 0 0 0 0 0 0 0
  2455 2468 2475 2496 2506 2530 2546 2647 2659 2661 2664
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  2702 2715 2746 2755 2775 2779 2849 2954 2955 2958 2989
0 0 0 0 0 0 0 0 0 0 0
  3018 3057 3083 3153 3179 3191 3212 3273 3301 3416 3441
0 0 0 0 0 1 0 0 0 0 0
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3479 3535 3564 3571 3572 3575 3585 3602 3629 3722 3725 0 0 0 1 0 0 0 0 0 0 0 3732 3733 3750 3826 3951 3974 3987 4009 4109 4131 4160 0 0 0 0 0 0 0 0 0 1 0 4258 4408 4546 4578 4942 5146 5226 5237 5319 5389 5670 0  $0 \ 0 \ 0 \ 0 \ 0 \ 0 \ 0 \ 0 \ 0$ 5946 6035 6165 6432 6441 7238 7350 7565 8039 8702 8715 0 0 0 0 0 0 0 0 0 0 0 9142 9643 9857 10270 10766 0 0 0 0 0 0 [ reached getOption("max.print") -- omitted 271 rows ] > EUSales Usercount <- table(Videogames\$EU Sales, Videogames\$User Count) > barplot(EUSales\_Usercount, xlab = 'User Count', ylab= 'EU Sales') > par(mfrow = c(2,2))> barplot(EUSales\_Criticscore, xlab = 'Critic Score', ylab= 'EU Sales', main = "Eu Sales vs Critic Score", col= 'red') > barplot(EUSales\_Criticcount, xlab = 'Critic Count', ylab= 'EU Sales',main = "Eu Sales vs Critic Count", col= 'blue') > barplot(EUSales\_Userscore, xlab = 'User Score', ylab= 'EU Sales', main = "Eu Sales vs User Score", col= 'purple') > barplot(EUSales\_Usercount, xlab = 'User Count', ylab= 'EU Sales', main = "Eu Sales vs User Count", col= 'pink')









- > # Building the multiple regression model
- >
- > #Model1
- > Im(EU Sales ~ NA Sales+ Global Sales+JP Sales+

Other\_Sales+Critic\_Score+Critic\_Count+ User\_Score + User\_Count, data= Videogames)

### Call:

## Coefficients:

```
> model1<- Im(EU_Sales ~ NA_Sales+ Global_Sales+JP_Sales+
Other_Sales+Critic_Score+Critic_Count+ User_Score + User_Count, data= Videogames)
> summary(model1)
```

#### Call:

```
Im(formula = EU_Sales ~ NA_Sales + Global_Sales + JP_Sales +
Other_Sales + Critic_Score + Critic_Count + User_Score +
User Count, data = Videogames)
```

### Residuals:

Min 1Q Median 3Q Max
-0.020042 0.000090 0.000237 0.000296 0.020302

# Coefficients:

Estimate Std. Error t value Pr(>|t|) (Intercept) -3.75e-04 4.09e-04 -0.92 0.36 NA\_Sales -1.00e+00 3.18e-04 -3146.04 <2e-16 \*\*\* Global\_Sales 1.00e+00 2.08e-04 4817.10 <2e-16 \*\*\* JP Sales -1.00e+00 4.03e-04 -2481.31 <2e-16 \*\*\* Other\_Sales -1.00e+00 5.01e-04 -1996.40 <2e-16 \*\*\* Critic Score -7.55e-07 6.87e-06 -0.11 0.91 Critic\_Count 2.56e-06 4.23e-06 0.60 0.55 User Score 1.41e-05 6.13e-05 0.23 0.82 User\_Count 1.31e-07 1.35e-07 0.97 0.33 Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.00594 on 7103 degrees of freedom

Multiple R-squared: 1, Adjusted R-squared: 1

F-statistic: 1.17e+07 on 8 and 7103 DF, p-value: <2e-16

```
> #Model2
> Im(EU_Sales ~ NA_Sales+ Global_Sales+JP_Sales+ Other_Sales, data= Videogames)
Call:
Im(formula = EU_Sales ~ NA_Sales + Global_Sales + JP_Sales +
  Other_Sales, data = Videogames)
Coefficients:
(Intercept)
             NA_Sales Global_Sales
                                       JP Sales
 -0.000243
             -0.999759
                          0.999901
                                     -0.999849
Other_Sales
 -0.999849
> model2<- Im(EU_Sales ~ NA_Sales+ Global_Sales+JP_Sales+ Other_Sales, data=
Videogames)
> summary(model2)
Call:
Im(formula = EU_Sales ~ NA_Sales + Global_Sales + JP_Sales +
  Other_Sales, data = Videogames)
Residuals:
   Min
           1Q Median
                           3Q
                                  Max
```

-0.020098 0.000147 0.000228 0.000244 0.020221

## Coefficients:

```
Estimate Std. Error t value Pr(>|t|)
(Intercept) -2.43e-04 7.61e-05 -3.2 0.0014 **
NA Sales
          -1.00e+00 3.15e-04 -3171.2 <2e-16 ***
Global_Sales 1.00e+00 2.05e-04 4879.1 <2e-16 ***
JP_Sales -1.00e+00 3.96e-04 -2525.6 <2e-16 ***
Other_Sales -1.00e+00 5.00e-04 -1997.8 <2e-16 ***
```

```
Residual standard error: 0.00594 on 7107 degrees of freedom
                         Adjusted R-squared: 1
Multiple R-squared:
                    1,
F-statistic: 2.33e+07 on 4 and 7107 DF, p-value: <2e-16
>
>
> vg <- Videogames[,-c(1,2,3,4,5,15)] # Reduced dataframe(got down from 15 varibles to 9
variables)
>
> Im(EU_Sales~., data=vg)
Call:
Im(formula = EU\_Sales \sim ., data = vg)
Coefficients:
(Intercept)
             NA_Sales
                          JP_Sales Other_Sales
 -3.75e-04
             -1.00e+00
                          -1.00e+00
                                      -1.00e+00
Global_Sales Critic_Score Critic_Count User_Score
  1.00e+00
             -7.55e-07
                          2.56e-06
                                      1.41e-05
 User Count
  1.31e-07
> model3<-lm(EU_Sales~., data=vg)
> summary(model3)
Call:
Im(formula = EU\_Sales \sim ., data = vg)
Residuals:
   Min
           1Q Median
                            3Q
                                   Max
-0.020042 0.000090 0.000237 0.000296 0.020302
```

Signif. codes: 0 '\*\*\* 0.001 '\*\* 0.01 '\* 0.05 '. ' 0.1 ' ' 1

## Coefficients:

```
Estimate Std. Error t value Pr(>|t|)
(Intercept) -3.75e-04 4.09e-04 -0.92 0.36
NA_Sales -1.00e+00 3.18e-04 -3146.04 <2e-16 ***
JP_Sales -1.00e+00 4.03e-04 -2481.31 <2e-16 ***
Other_Sales -1.00e+00 5.01e-04 -1996.40 <2e-16 ***
Global_Sales 1.00e+00 2.08e-04 4817.10 <2e-16 ***
Critic Score -7.55e-07 6.87e-06 -0.11
                                        0.91
Critic_Count 2.56e-06 4.23e-06
                                 0.60
                                        0.55
User Score 1.41e-05 6.13e-05
                                  0.23
                                        0.82
User_Count 1.31e-07 1.35e-07
                                  0.97
                                         0.33
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.00594 on 7103 degrees of freedom
Multiple R-squared:
                   1,
                        Adjusted R-squared:
F-statistic: 1.17e+07 on 8 and 7103 DF, p-value: <2e-16
> #Model4 same as model 1
> Im(EU_Sales~., data=vg)
Call:
Im(formula = EU\_Sales \sim ., data = vg)
Coefficients:
(Intercept)
             NA_Sales
                         JP_Sales Other_Sales
 -3.75e-04
             -1.00e+00
                         -1.00e+00
                                    -1.00e+00
Global_Sales Critic_Score Critic_Count User_Score
  1.00e+00
             -7.55e-07
                         2.56e-06
                                     1.41e-05
 User_Count
  1.31e-07
```

```
> model4<-lm(EU_Sales~., data=vg)
> summary(model4)
```

## Call:

Im(formula = EU\_Sales ~ ., data = vg)

## Residuals:

Min 1Q Median 3Q Max -0.020042 0.000090 0.000237 0.000296 0.020302

## Coefficients:

Estimate Std. Error t value Pr(>|t|)

(Intercept) -3.75e-04 4.09e-04 -0.92 0.36

NA\_Sales -1.00e+00 3.18e-04 -3146.04 <2e-16 \*\*\*

JP Sales -1.00e+00 4.03e-04 -2481.31 <2e-16 \*\*\*

Other\_Sales -1.00e+00 5.01e-04 -1996.40 <2e-16 \*\*\*

Global\_Sales 1.00e+00 2.08e-04 4817.10 <2e-16 \*\*\*

Critic\_Score -7.55e-07 6.87e-06 -0.11 0.91

Critic\_Count 2.56e-06 4.23e-06 0.60 0.55

User\_Score 1.41e-05 6.13e-05 0.23 0.82

User\_Count 1.31e-07 1.35e-07 0.97 0.33

---

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.00594 on 7103 degrees of freedom

Multiple R-squared: 1, Adjusted R-squared: 1

F-statistic: 1.17e+07 on 8 and 7103 DF, p-value: <2e-16

>

## > # corellation of the new dataframe

> cor(vg)

NA\_Sales EU\_Sales JP\_Sales Other\_Sales Global\_Sales

NA_Sales	1.0000	0.838	0.46	59	0.72	276	0.9549	
EU_Sales	0.8382	1.000	0.51	85	0.71	82	0.9385	
JP_Sales	0.4659	0.519	1.000	00	0.39	35	0.6119	
Other_Sales	0.7276	0.718	0.39	935	1.0	000	0.8054	
Global_Sales	0.9549	0.938	0.6	119	0.8	054	1.0000	
Critic_Score	0.2341	0.212	0.14	58	0.19	15	0.2373	
Critic_Count	0.2863	0.268	0.17	11	0.24	20	0.2932	
User_Score	0.0857	0.055	0.12	271	0.0	567	0.0879	
User_Count	0.2458	0.284	0.07	737	0.2	420	0.2649	
Critic_Score Critic_Count User_Score User_Count								
NA_Sales	0.234	0.2	286	0.08	357	0.24	58	
EU_Sales	0.212	2 0.2	268	0.05	550	0.28	44	
JP_Sales	0.146 0		171 0.12		71	0.073	37	
Other_Sales	0.19	1 0.	242	0.0	0.0567		0.2420	
Global_Sales	0.23	7 0	0.293 0.0		879	0.26	649	
Critic_Score	1.000	0.3	392	0.5837		0.264	43	
Critic_Count	0.392	1.0	000	0.19	0.1937		11	
User_Score	0.584	4 0.	194	1.0000		0.01	89	

- > # performing pairwise scatterplor
- > # plotting a scatterplot for 1000 random obeservation from vg dataframe, without replacement

\_

User\_Count

- > nrow(vg) # gives the total number of rows in a dataframe [1] 7112
- > sample(1:nrow(vg), 1000, replace = FALSE)
  - [1] 592 5769 996 5124 6264 5029 5227 1301 1061 5445 2715 2410

- [13] 180 4375 4437 6325 4158 2662 4169 4021 3187 2057 2812 3656
- $[25]\ 2332\ 5027\ 3276\ 2683\ \ 560\ 5546\ 4937\ 1642\ 5019\ 5278\ 3275\ \ 107$
- [37] 2292 3664 5693 2349 6091 3974 6624 6046 6515 747 2657 5422

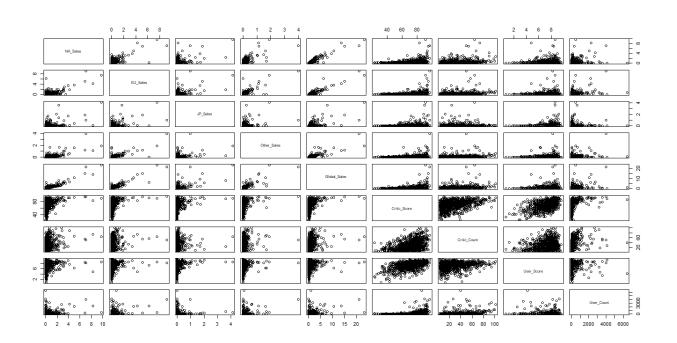
```
[49] 4544 1743 5087 6742 5194 599 6927 733 4646 5825 2461 4863
[61] 3781 3690 3600 6781 184 4276 3424 3030 4252 5128 6631 624
[73] 7105 1103 5582 4629 5815 153 1104 752 3012 3431 811 4507
[85] 5491 6245 7098 3283 6030 6306 922 3354 2787 2889 1926 335
[97] 6444 6259 921 2849 3027 2626 4776 897 2389 1862 6192 5401
[109] 1690 299 2387 212 176 4023 3840 2120 5530 3976 3263 3184
[121] 2670 2960 6951 6307 5877 1431 372 5165 4899 4951 5349 4414
[133] 2107 5631 2768 4470 4219 3649 5177 152 1526 5956 5342 344
[145] 3916 1025 6678 2725 2834 2351 1854 4586 979 3375 5949 61
[157] 2160 5461 3196 2793 6560 360 2320 1549 627 1287 1929 5149
[169] 91 3722 200 4144 433 6498 5736 1122 3229 3736 4303 3881
[181] 6368 1170 5042 5645 2695 5148 6902 1617 1319 1093 813 3771
[193] 1206 3220 3820 3818 2093 5058 3883 647 100 3528 1272 6924
[205] 6829 3019 6692 4648 142 5709 2216 5580 3189 131 2383 5735
[217] 6549 817 4293 3804 1877 4538 1773 2172 1607 2906 2887 6785
[229] 4982 5884 6467 4552 6717 6671 3432 799 6676 5012 5912 1990
[241] 1324 1673 3954 129 2777 4948 5988 1629 1903 5730 6969 2077
[253] 4183 6080 4849 835 6945 5640 6438 4341 4755 779 981 4930
[265] 3035 6622 322 5384 3454 3067 38 6680 2758 4285 7048 4720
[277] 5122 827 4225 406 5911 2315 763 1556 489 1135 5496 6875
[289] 4357 610 2434 7076 1344 1066 3718 6166 1006 584 2707 3802
[301] 4657 341 3864 2851 2643 5282 1310 5929 4306 1519 2935 4581
[313] 6246 6301 6800 2390 2990 214 2275 6887 615 6657 6414 1213
[325] 357 4532 2096 3659 6168 211 5199 1111 5830 4622 1432 2697
[337] 1412 122 4871 4917 3654 6148 4238 874 2479 7063 3230 3789
[349] 4765 7039 5762 4157 2106 5486 3559 5668 4614 6050 879 1110
[361] 207 3091 2553 2983 6979 6977 2781 5385 6023 2205 4907 1052
[373] 2125 1215 31 1041 4617 596 5678 4596 2118 534 2798 1167
[385] 1187 4531 988 1980 3555 2458 210 1442 1420 3182 3841 266
[397] 4897 3463 6587 764 883 283 4572 2259 6684 4571 3345 790
[409] 3927 2374 4550 6823 6543 1460 1927 1106 376 6131 3565 2816
[421] 5025 1417 6929 3991 3977 1659 4028 4594 5931 274 4853 5548
[433] 6231 2191 2197 2185 6466 1594 3866 3835 6833 1497 7047 5315
```

```
[445] 3491 990 6492 6314 900 6145 3624 795 1237 3619 2828 6338
[457] 8 5187 5604 626 4398 5987 3309 5216 2163 145 2582 2319
[469] 5691 3994 5739 6725 2529 3677 1615 97 5655 6527 4519 5996
[481] 554 3154 845 3549 6230 6554 1724 3131 5484 4430 4728 315
[493] 4621 3894 3566 3790 4195 6136 4719 1051 5982 953 6103 1231
[505] 3605 3844 1685 5259 771 6378 1869 5924 1314 2879 1297 264
[517] 2448 6147 5020 4175 4781 4421 4439 6787 4425 7091 1897 3352
[529] 654 2759 5554 4502 3127 6422 1601 2881 842 4051 5529 5303
[541] 3364 563 1924 24 6501 5627 1267 4749 4373 718 5555 7014
[553] 3142 2523 5685 5688 1905 5231 4257 3570 6141 5910 1441 908
[565] 5189 257 1639 4613 4387 5764 2215 81 5443 672 2186 4545
[577] 3571 2740 702 6947 2905 706 1987 6331 5204 4025 6545 6449
[589] 657 289 6204 6173 6790 1825 825 6405 5126 1338 5009 6620
[601] 4239 6760 6714 6028 5941 1014 785 4394 694 4007 5388 4768
[613] 1120 3168 1635 4962 4420 3527 4369 4317 2724 2505 2998 723
[625] 5601 5302 3271 428 936 3842 5108 2134 3058 4869 4626 202
[637] 820 3143 6480 7074 4649 1459 6630 277 6815 386 4200 1989
[649] 5415 2462 3482 2959 2423 4485 5222 1622 2018 2666 1070 3785
[661] 3956 1823 5403 1696 5861 6308 3715 5136 3897 2407 6164 881
[673] 5102 71 37 3621 660 6334 3086 3133 6688 141 511 2062
[685] 2925 6513 804 192 193 5994 1446 5252 1587 3698 2659 5847
[697] 2555 213 3518 4642 6718 1178 2869 2693 6450 1922 1804 6858
[709] 3387 3887 2671 5593 4151 6253 5081 5292 512 261 5897 5200
[721] 139 1695 2773 5524 894 3050 611 1434 3777 1466 6118 1747
[733] 6104 2534 6345 1849 242 4558 295 5370 1000 4980 4364 2861
[745] 116 5198 635 1339 6792 6445 98 591 5088 6528 6090 2717
[757] 609 6220 4111 6709 143 2352 6454 5646 4528 232 1422 4787
[769] 3738 4735 5513 4310 3123 2369 150 1047 1896 2645 5217 860
[781] 1395 2342 1139 1286 1652 5761 2142 3830 4958 2988 5107 6505
[793] 4658 4385 1566 2734 7011 5649 3903 2029 1269 3159 5837 6660
[805] 2078 719 2711 3348 2090 5632 1881 4840 2870 419 1501 924
[817] 2729 2603 4462 5224 1166 6309 3825 5151 5396 2114 439 2095
[829] 3488 4886 3495 1307 2979 562 5389 3130 2043 1143 3731 6988
```

[841] 3191 3223 4351 3541 3113 2363 6647 3413 5188 3183 2416 3544 [853] 2655 5212 3396 1275 4332 529 2150 2282 3023 1384 1973 1255 [865] 6652 5812 1762 6365 2002 4736 5878 182 3162 1394 1886 2827 [877] 1693 1720 3069 1611 3292 3712 1879 1700 6288 2702 3855 2244 [889] 4638 76 318 3560 6868 5770 3631 821 4356 1847 935 2919 [901] 218 5374 1016 2947 5865 3013 2636 5721 4083 2913 6172 1546 [913] 3010 2048 1017 5062 3486 1614 2413 4140 6548 2098 3350 1574 [925] 5543 5916 6663 3629 6912 994 3717 4300 7037 3914 3907 6188 [937] 1095 3129 6984 6852 1683 438 1197 1181 3297 2918 2682 2792 [949] 4969 2980 855 1577 6113 4418 623 3545 7045 4509 5166 5250 [961] 5857 3856 5433 2807 4331 3307 4766 1822 4295 4237 3869 3980 [973] 5504 3399 5674 4905 1755 417 5294 6311 1118 2068 6637 6942 [985] 3610 3732 3109 5141 60 6940 1392 3233 3112 658 4724 6997 [997] 6715 154 1898 7085

>

- > vgsample<- vg[sample(1:nrow(vg), 1000, replace = FALSE),] # 1000 random observations from vg
- > plot(vgsample)
- > # scatter plot is made to identify the second order terms



```
> # Second order Term
```

```
> vg <- Videogames[,-c(1,2,3,4,5,15)] # Reduced dataframe(got down from 15 varibles to 9
variables)
>
> Im(EU_Sales~., data=vg)
Call:
Im(formula = EU_Sales ~ ., data = vg)
Coefficients:
(Intercept)
             NA_Sales
                         JP_Sales Other_Sales
 -3.75e-04
             -1.00e+00
                         -1.00e+00
                                     -1.00e+00
Global_Sales Critic_Score Critic_Count User_Score
  1.00e+00
             -7.55e-07
                          2.56e-06
                                      1.41e-05
 User_Count
  1.31e-07
> model4<-lm(EU_Sales~., data=vg)
> summary(model4)
Call:
Im(formula = EU_Sales ~ ., data = vg)
Residuals:
   Min
           1Q Median
                            3Q
                                  Max
-0.020042 0.000090 0.000237 0.000296 0.020302
Coefficients:
        Estimate Std. Error t value Pr(>|t|)
(Intercept) -3.75e-04 4.09e-04 -0.92
NA_Sales -1.00e+00 3.18e-04 -3146.04 <2e-16 ***
```

```
-1.00e+00 4.03e-04 -2481.31 <2e-16 ***
Other_Sales -1.00e+00 5.01e-04 -1996.40 <2e-16 ***
Global_Sales 1.00e+00 2.08e-04 4817.10 <2e-16 ***
Critic Score -7.55e-07 6.87e-06 -0.11
                                          0.91
Critic_Count 2.56e-06 4.23e-06 0.60
                                          0.55
User_Score 1.41e-05 6.13e-05
                                   0.23 0.82
User Count 1.31e-07 1.35e-07
                                   0.97 0.33
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.00594 on 7103 degrees of freedom
Multiple R-squared: 1, Adjusted R-squared:
F-statistic: 1.17e+07 on 8 and 7103 DF, p-value: <2e-16
> vg$User_ScoreSQ<- (vg$User_Score)^2
> vg$Critic_CountSQ<- (vg$Critic_Count)^2
> # F test looks good
> # This shows that atleat 1 beta is not equal to zero|| 99% of variablity global sales is
explined by the model
> # Null Hypothesis is rejected and the alternative is accepted
> # t-test looks good- The beta associated with global_sales is equal zero, we can reject
that and accept the alternative, that it the beta is not equal to zero and use that estimation
>
>
> # Second order Term and Interaction term
> vg <- Videogames[,-c(1,2,3,4,5,15)] # Reduced dataframe(got down from 15 varibles to 9
variables)
>
> Im(EU_Sales~., data=vg)
```

Call:

```
Im(formula = EU_Sales ~ ., data = vg)
```

## Coefficients:

(Intercept) NA\_Sales JP\_Sales Other\_Sales
-3.75e-04 -1.00e+00 -1.00e+00 -1.00e+00
Global\_Sales Critic\_Score Critic\_Count User\_Score
1.00e+00 -7.55e-07 2.56e-06 1.41e-05
User\_Count
1.31e-07

> model5<-Im(EU\_Sales~., data=vg)
> summary(model5)

## Call:

Im(formula = EU\_Sales ~ ., data = vg)

## Residuals:

Min 1Q Median 3Q Max
-0.020042 0.000090 0.000237 0.000296 0.020302

## Coefficients:

Estimate Std. Error t value Pr(>|t|) (Intercept) -3.75e-04 4.09e-04 -0.92 0.36 -1.00e+00 3.18e-04 -3146.04 <2e-16 \*\*\* NA Sales JP Sales -1.00e+00 4.03e-04 -2481.31 <2e-16 \*\*\* Other\_Sales -1.00e+00 5.01e-04 -1996.40 <2e-16 \*\*\* Global\_Sales 1.00e+00 2.08e-04 4817.10 <2e-16 \*\*\* Critic\_Score -7.55e-07 6.87e-06 -0.11 0.91 Critic\_Count 2.56e-06 4.23e-06 0.60 0.55 User\_Score 1.41e-05 6.13e-05 0.23 0.82 User\_Count 1.31e-07 1.35e-07 0.97 0.33

---

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.00594 on 7103 degrees of freedom

Multiple R-squared: 1, Adjusted R-squared: 1

F-statistic: 1.17e+07 on 8 and 7103 DF, p-value: <2e-16

- > vg\$User\_ScoreSQ<- (vg\$User\_Score)^2
- > vg\$Critic\_CountSQ<- (vg\$Critic\_Count)^2
- > vg\$oth\_glo <- (vg\$Other\_Sales\*vg\$Global\_Sales)</pre>
- > # F test looks good
- > # Null Hypothesis is rejected and the alternative is accepted
- > # This shows that at least 1 beta is not equal to zero|| 99% of variability global sales is explained by the model
- > # t-test looks good- The beta associated with global\_sales is equal zero, we can reject that and accept the alternative, that it the beta is not equal to zero and use that estimation

>

- > # There is no change in the adjusted r square of the model, since there is no change we can probably take the interaction term out and we will be back to model4
- > # Checked with other interaction terms and binary variables, but there is no change in the adjusted r square
- > #Checking regression after adding second order term user score square
- > Im(EU\_Sales~., data=vg)

#### Call:

 $Im(formula = EU\_Sales \sim ., data = vg)$ 

## Coefficients:

1.00e+00 -2.65e-06 1.24e-05 4.58e-04
User\_Count User\_ScoreSQ Critic\_CountSQ oth\_glo
1.53e-07 -3.50e-05 -1.45e-07 -1.94e-05

> model4<-Im(EU\_Sales~., data=vg)

> summary(model4)

## Call:

Im(formula = EU\_Sales ~ ., data = vg)

#### Residuals:

Min 1Q Median 3Q Max
-0.020335 0.000040 0.000213 0.000366 0.020252

## Coefficients:

Estimate Std. Error t value Pr(>|t|)

(Intercept) -1.72e-03 9.53e-04 -1.80 0.071.

NA Sales -1.00e+00 3.19e-04 -3130.72 <2e-16 \*\*\*

JP Sales -1.00e+00 4.11e-04 -2433.45 <2e-16 \*\*\*

Other Sales -1.00e+00 5.14e-04 -1945.38 <2e-16 \*\*\*

Global\_Sales 1.00e+00 2.12e-04 4712.68 <2e-16 \*\*\*

Critic\_Score -2.65e-06 6.96e-06 -0.38 0.703

Critic\_Count 1.24e-05 1.24e-05 1.00 0.320

User Score 4.58e-04 2.99e-04 1.53 0.126

User\_Count 1.53e-07 1.41e-07 1.08 0.279

User\_ScoreSQ -3.50e-05 2.34e-05 -1.50 0.134

Critic CountSQ -1.45e-07 1.55e-07 -0.94 0.349

oth\_glo -1.94e-05 1.22e-05 -1.59 0.113

---

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.00594 on 7100 degrees of freedom

Multiple R-squared: 1, Adjusted R-squared: 1

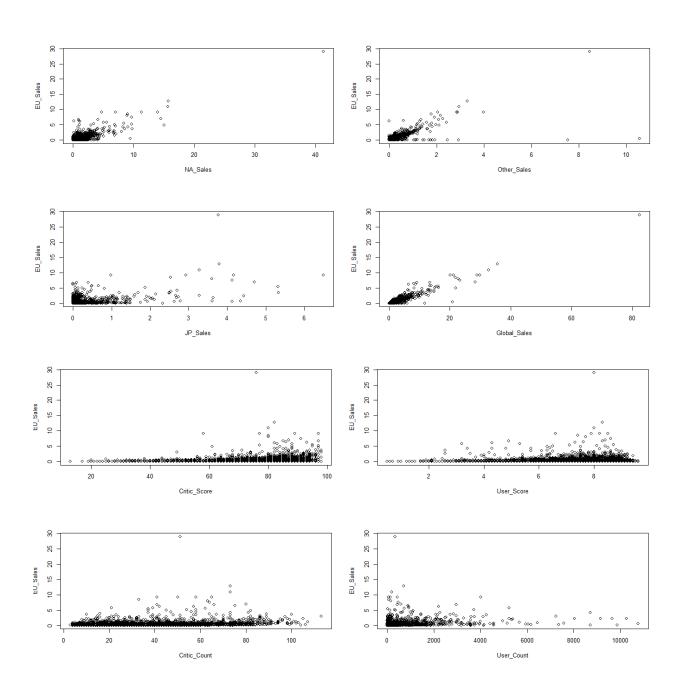
F-statistic: 8.48e+06 on 11 and 7100 DF, p-value: <2e-16

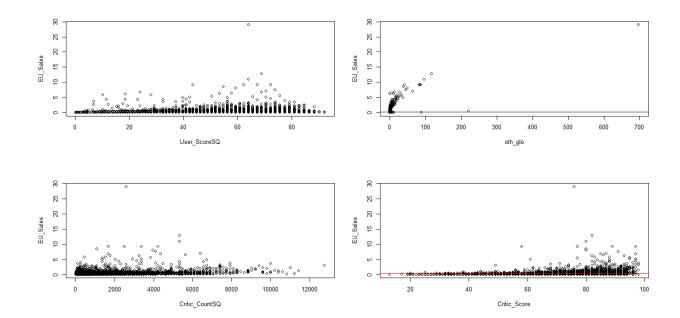
> plot(EU\_Sales~., data=vg)

Hit <Return> to see next plot:

Hit <Return> to see next plot:

Hit <Return> to see next plot:





# > vg\$EU\_Sales

[1] 28.96 12.80 10.95 9.15 9.18 6.95 7.48 8.03 4.91 8.49 [11] 9.14 0.40 9.20 5.17 5.49 5.35 5.09 4.26 3.70 5.73 [21] 4.26 3.60 6.77 5.73 4.51 4.19 2.56 4.37 3.45 2.81 [31] 0.01 3.36 3.07 3.87 3.05 4.82 3.64 3.70 2.58 3.11 [41] 3.27 1.97 2.30 2.47 3.42 2.85 3.63 2.37 2.43 6.75 [51] 1.85 2.80 6.13 1.53 3.48 2.25 5.01 2.07 6.42 1.72 [61] 1.72 2.81 3.48 2.36 1.90 3.42 2.11 2.98 2.25 2.83 [71] 2.99 2.89 2.22 2.14 1.75 1.04 3.02 2.75 2.16 1.90 [81] 2.75 2.26 2.20 2.75 2.53 4.24 1.80 2.52 1.30 2.61 [91] 1.58 1.20 1.97 1.34 1.26 6.22 2.80 1.59 1.73 1.88 [101] 4.33 2.01 1.83 1.71 0.00 2.19 1.98 1.47 2.57 0.67 [111] 1.89 2.32 2.07 1.56 1.91 1.93 1.64 1.90 1.24 1.85 [121] 0.55 1.64 2.29 1.83 2.23 1.21 0.77 2.81 1.40 1.69 [131] 1.08 1.55 1.55 0.26 0.75 2.43 3.47 2.17 2.23 0.63 [141] 1.08 1.41 1.80 3.28 1.16 1.99 1.38 0.01 1.17 0.99 [151] 1.72 0.26 1.69 2.00 1.34 1.79 1.57 1.48 2.10 1.27 [161] 1.41 1.95 1.97 1.12 1.39 1.29 0.99 1.11 1.97 1.24

[171] 0.26 0.91 0.24 1.51 1.23 1.29 1.11 1.29 2.39 1.03

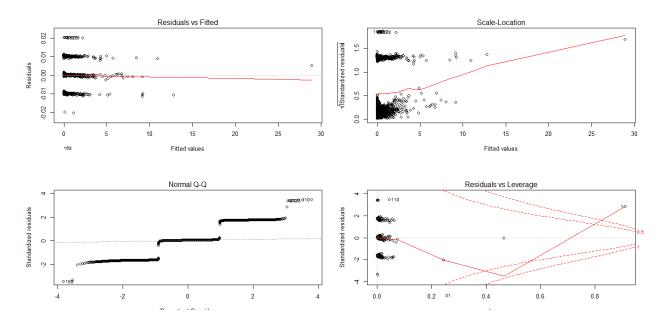
```
[181] 1.37 1.79 1.33 1.72 0.58 1.24 1.31 1.11 0.00 2.89
[191] 2.01 1.01 2.55 2.30 1.47 1.82 1.04 0.21 2.22 0.00
[201] 1.93 1.52 1.73 0.04 2.18 1.03 1.47 1.27 1.51 1.85
[211] 2.09 0.87 1.13 1.17 1.76 2.16 0.48 1.35 0.66 1.17
[221] 1.94 1.60 1.89 1.12 1.43 1.56 1.91 1.01 1.56 2.00
[231] 1.69 0.86 1.58 2.48 1.18 1.59 1.21 0.81 1.09 0.00
[241] 0.83 2.45 0.96 1.55 1.22 1.17 0.67 1.02 1.49 0.98
[251] 0.90 1.40 1.77 1.13 2.39 0.49 0.93 0.38 1.42 2.36
[261] 1.02 0.95 1.01 0.34 1.01 1.79 0.71 2.01 1.27 0.97
[271] 1.36 2.07 1.20 1.05 1.03 2.28 1.47 0.92 1.12 1.70
[281] 1.29 1.39 0.91 1.05 1.00 1.11 1.28 0.92 1.68 1.05
[291] 1.57 2.12 0.30 1.11 2.30 1.93 1.00 1.29 1.12 0.59
[301] 0.76 0.56 1.07 0.16 0.00 1.10 1.25 1.03 1.56 1.03
[311] 1.00 0.50 0.85 0.94 0.81 0.28 0.16 1.21 0.98 1.01
[321] 0.88 0.84 0.84 0.79 1.21 1.04 1.85 0.20 1.06 1.32
[331] 0.63 0.00 1.18 1.26 0.86 1.43 1.01 0.80 1.37 1.15
[341] 1.10 0.51 0.70 0.77 0.68 0.77 0.04 0.79 1.14 1.24
[351] 0.86 0.32 1.12 1.04 1.12 0.72 0.82 0.15 0.63 1.31
[361] 0.53 0.09 0.85 0.67 0.55 1.04 0.98 0.22 0.74 0.86
[371] 1.23 1.13 1.43 1.12 0.77 1.14 0.07 0.97 1.19 0.92
[381] 0.52 0.48 0.92 0.11 0.64 1.34 0.12 1.11 1.39 0.51
[391] 0.92 1.09 0.95 0.58 0.63 1.11 1.40 1.11 0.73 0.47
[401] 0.80 0.14 0.12 1.79 0.80 1.22 0.44 0.82 0.21 1.63
[411] 1.05 0.82 0.88 0.84 0.08 1.03 0.27 0.22 0.59 0.55
[421] 1.22 0.57 0.12 0.83 0.19 1.65 1.12 0.85 0.02 0.52
[431] 0.77 0.36 0.84 0.33 0.43 1.04 0.84 0.54 0.53 0.12
[441] 0.93 1.19 0.08 0.60 0.97 0.22 1.17 0.26 0.00 0.70
[451] 0.15 0.37 0.61 0.57 1.32 0.69 0.02 1.08 0.45 0.01
[461] 0.86 0.15 0.13 0.45 0.43 1.09 0.00 0.61 0.70 0.72
[471] 0.43 0.25 1.06 0.64 0.72 0.80 0.91 0.80 0.99 1.27
[481] 1.21 0.81 0.07 0.54 0.60 0.73 0.10 0.73 0.06 0.59
[491] 0.79 0.44 0.15 0.25 0.81 0.63 0.53 0.71 0.91 0.84
[501] 0.62 0.50 0.83 0.72 1.03 0.40 0.85 0.02 0.24 0.96
```

```
[511] 0.59 0.25 0.54 0.44 0.96 0.77 1.42 0.20 1.47 0.67
[521] 0.30 0.83 0.67 0.03 1.05 0.68 1.02 0.46 0.81 0.37
[531] 0.61 0.26 0.31 0.94 0.31 0.21 0.31 0.07 0.05 0.12
[541] 0.60 0.63 0.64 0.32 0.71 0.04 0.33 0.56 0.49 0.44
[551] 0.12 0.93 0.52 1.24 0.39 0.41 0.09 0.41 0.62 0.62
[561] 0.79 0.48 1.00 0.04 0.73 0.02 1.02 1.10 0.91 0.48
[571] 0.41 0.58 0.63 0.45 0.18 1.08 0.04 0.51 0.39 0.88
[581] 1.04 0.28 0.66 1.27 0.89 0.64 0.64 0.26 0.92 0.95
[591] 0.58 0.50 0.60 0.93 0.65 1.01 0.61 0.20 0.74 0.02
[601] 0.62 0.23 0.89 0.79 1.26 0.15 0.93 0.58 0.40 0.54
[611] 0.72 0.91 0.96 0.80 0.73 0.16 0.55 0.75 0.96 0.75
[621] 1.03 0.00 0.83 0.14 0.56 0.43 0.72 0.66 0.53 0.03
[631] 0.16 0.79 0.03 0.69 0.44 0.56 0.71 0.42 0.49 0.18
[641] 0.89 0.37 0.05 0.34 0.73 0.82 0.47 0.76 0.07 0.00
[651] 0.33 0.53 0.59 0.44 0.69 0.86 0.20 0.59 0.00 0.74
[661] 0.29 1.01 0.02 0.76 0.29 0.61 0.58 0.02 0.44 0.54
[671] 0.38 0.67 0.46 0.67 0.95 0.87 0.45 0.92 1.08 1.06
[681] 0.53 0.66 0.77 0.78 0.47 0.49 0.52 0.44 0.15 0.68
[691] 0.66 0.18 0.70 0.88 0.03 0.21 0.98 0.50 0.39 0.34
[701] 0.55 0.40 0.91 0.60 0.65 0.05 0.87 0.34 0.60 0.66
[711] 0.12 0.70 0.42 0.52 0.54 0.66 0.00 0.27 0.40 0.46
[721] 0.52 0.05 0.39 0.49 0.42 0.32 0.55 0.58 0.09 0.62
[731] 0.45 1.02 0.61 0.56 0.63 0.50 0.15 0.69 0.12 0.21
[741] 0.11 0.30 0.69 0.72 0.54 0.37 0.63 0.88 0.02 0.80
[751] 0.25 0.34 0.81 0.48 0.62 0.09 0.95 0.76 0.46 0.11
[761] 0.41 0.02 0.62 0.85 0.38 0.60 0.04 0.83 0.48 0.44
[771] 0.12 1.58 0.69 0.36 0.37 1.10 0.26 0.48 0.43 0.70
[781] 0.65 0.58 0.45 0.53 0.35 0.09 0.60 0.57 0.50 0.53
[791] 0.11 0.02 0.48 0.60 0.78 0.40 0.54 0.43 0.67 0.59
[801] 0.80 0.57 0.87 0.55 0.48 0.46 0.44 0.87 0.43 0.02
[811] 0.47 0.47 0.07 0.66 0.65 0.70 0.63 0.52 0.15 0.43
[821] 0.90 0.40 0.31 0.05 0.64 0.44 0.03 0.77 1.16 0.47
[831] 0.62 0.32 0.52 0.78 0.07 0.49 0.20 0.38 0.43 0.00
```

```
[841] 0.52 0.69 0.68 0.37 0.57 0.35 0.51 0.56 0.51 0.20
[851] 0.59 0.40 0.03 0.34 0.19 0.29 0.37 0.40 0.24 0.46
[861] 0.48 0.47 0.32 0.55 0.31 0.35 0.45 0.75 1.08 0.89
[871] 0.32 0.08 0.37 0.54 0.56 0.38 0.39 0.75 0.21 0.00
[881] 0.57 1.13 0.33 0.42 0.37 0.45 0.46 0.43 0.54 0.77
[891] 0.22 0.08 0.48 0.62 0.47 0.06 0.07 0.40 0.39 0.78
[901] 0.17 0.54 0.33 0.51 0.28 0.39 0.38 0.44 0.52 1.05
[911] 0.53 0.18 0.43 0.30 0.69 0.37 0.53 0.47 0.02 0.53
[921] 0.01 0.41 0.45 0.59 0.33 0.55 0.34 0.57 0.51 0.70
[931] 0.45 0.57 0.66 0.87 0.52 0.50 0.60 0.47 0.28 0.72
[941] 0.42 0.52 0.57 0.65 0.05 0.76 0.73 0.89 0.49 0.21
[951] 0.34 0.44 0.16 0.28 0.43 0.75 0.03 0.22 0.05 0.04
[961] 0.51 0.35 0.06 0.40 0.50 0.34 0.35 0.51 0.30 0.49
[971] 0.57 0.49 0.56 0.31 0.13 0.08 0.56 0.41 0.37 0.38
[981] 0.39 0.58 0.45 0.50 0.35 0.44 0.43 0.23 0.04 0.02
[991] 0.56 0.41 0.06 0.01 0.39 0.16 0.57 0.47 0.34 0.00
[ reached getOption("max.print") -- omitted 6112 entries ]
> mean(vg$EU_Sales)
[1] 0.233
> mean.vg= mean(vg$EU_Sales) # mean of the EU sales
> abline(h= mean.vg) # Ploting a horizontal line at the mean value of the EUsales
> plot(EU_Sales~Critic_Score, data = vg)
> mean(vg$EU_Sales)
[1] 0.233
>
> mean.EU_Sales = mean(vg$EU_Sales)
> abline(h= mean.EU_Sales, col= 'red')
> model4<-lm(EU_Sales~., data=vg)
```

## > abline(h= mean.EU\_Sales, col= 'red')

# > plot(model4)



> # ====Pseudo Random Number Generators=====

>

> # we will set and seed and generate a random number, this is reproduce our experiments

>

> set.seed(123)

> runif(1) #

# generates a psudo random number

[1] 0.288

>

>

\_

> # -----test and trained data set ------

# model is buit entirely on trained dataset, but is evaluated on the test data

> vg <- Videogames[,-c(1,2,3,4,5,15)] # removed X,name and platform columns

>

> # partition of the dataset

>

> partition<- sample(2, nrow(vg), replace = TRUE, prob = c(0.80,0.20))

> # we can give the value over and over again and the distribution is 80 and 20

```
>
```

>

```
> partition # approximately 80% of these are 1's and aprroximately 20% of these are 2's
[1] 1 1 2 2 1 1 2 1 1 2 1 1 1 1 2 1 1 1 2 2 1 1 2 1 1 1 1 1 1 2
[91] 1 1 1 1 1 1 1 1 1 1 1 1 1 2 1 2 2 1 1 1 2 1 1 2 1 1 1 1 1 1
[241] 1 1 1 1 1 1 2 2 1 1 1 1 1 1 1 1 1 1 2 2 2 1 2 1 1 1 1 1 1 1 2
[301] 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 2 2 1 1 2 2 1 1 1 1 1 1 2 1 1 2 1
[331] 1 1 2 1 1 1 1 1 1 2 1 1 1 1 1 1 2 1 1 1 1 2 1 1 1 1 2 1 1 1 2 1
[361] 1 2 1 1 1 1 1 1 1 1 1 1 2 1 1 2 1 1 1 2 1 1 1 1 1 1 2 1 1 1 1 2
[451] 1 1 1 1 2 2 1 1 1 2 1 1 1 1 1 1 1 1 2 1 2 1 1 1 1 1 1 1 1
[571] 2 1 1 2 1 1 1 1 1 1 2 2 2 1 2 1 1 1 2 1 1 1 2 1 1 2 1 1 2 1 1
[661] 2 1 1 1 1 2 1 1 1 1 1 1 1 1 1 1 2 1 1 1 1 1 1 2 2 2 1 1 1 1 1 1
[841] 1 1 1 1 1 2 1 1 1 1 1 2 1 1 1 2 1 1 1 2 1 1 1 1 1 1 1 1 1 1 1 1 1 1
```

```
[961] 1 1 1 2 1 1 1 1 1 1 1 1 2 1 1 1 2 1 1 1 1 1 2 1 2 1 1 1 1 1 1 1
[991] 1 1 1 1 2 1 1 1 1 1
[ reached getOption("max.print") -- omitted 6112 entries ]
> # we will use this list to create training and test set
> # ----traing dataset---
> train<- vg[partition==1, ]
> partition==1 # when it is true I will accept it into training data and when it is false i will
reject it into my training data
 [1] TRUE TRUE FALSE FALSE TRUE TRUE FALSE TRUE TRUE FALSE
[11] TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE FALSE FALSE
[21] TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE TRUE FALSE
[51] TRUE TRUE TRUE TRUE TRUE TRUE TRUE FALSE TRUE TRUE
[61] TRUE TRUE TRUE FALSE TRUE FALSE FALSE TRUE TRUE TRUE
[81] TRUE TRUE TRUE TRUE TRUE FALSE FALSE TRUE TRUE
[101] TRUE TRUE FALSE TRUE FALSE FALSE TRUE TRUE TRUE FALSE
[111] TRUE TRUE FALSE TRUE TRUE TRUE FALSE TRUE TRUE TRUE
[121] TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE
[131] FALSE TRUE TRUE TRUE TRUE FALSE TRUE FALSE TRUE TRUE
[141] TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE FALSE
[171] TRUE FALSE TRUE TRUE TRUE TRUE TRUE FALSE TRUE FALSE
[181] TRUE TRUE TRUE TRUE TRUE TRUE TRUE FALSE FALSE TRUE
[191] TRUE FALSE TRUE FALSE TRUE TRUE TRUE TRUE TRUE TRUE
```

```
[201] FALSE TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE
[211] TRUE TRUE TRUE TRUE TRUE TRUE TRUE FALSE FALSE TRUE
[221] FALSE TRUE TRUE TRUE TRUE TRUE TRUE TRUE FALSE TRUE
[231] TRUE TRUE TRUE TRUE TRUE TRUE FALSE TRUE FALSE TRUE
[241] TRUE TRUE TRUE TRUE TRUE TRUE FALSE FALSE TRUE TRUE
[261] FALSE TRUE FALSE TRUE TRUE TRUE TRUE TRUE TRUE FALSE
[271] TRUE TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE
[291] TRUE TRUE FALSE TRUE FALSE FALSE TRUE TRUE TRUE TRUE
[311] TRUE TRUE TRUE FALSE FALSE TRUE TRUE FALSE FALSE
[321] TRUE TRUE TRUE TRUE TRUE FALSE TRUE TRUE FALSE TRUE
[331] TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE FALSE TRUE
[341] TRUE TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE
[351] FALSE TRUE TRUE TRUE FALSE TRUE TRUE TRUE FALSE TRUE
[371] TRUE FALSE TRUE TRUE FALSE TRUE TRUE TRUE FALSE TRUE
[381] TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE FALSE
[411] FALSE TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE
[421] TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE FALSE FALSE
[431] TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE TRUE TRUE
[441] TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE TRUE
[451] TRUE TRUE TRUE TRUE FALSE FALSE TRUE TRUE TRUE FALSE
[481] FALSE TRUE TRUE FALSE TRUE TRUE TRUE TRUE FALSE FALSE
[491] TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE
[501] TRUE TRUE TRUE TRUE TRUE TRUE FALSE TRUE TRUE
[511] TRUE FALSE TRUE TRUE TRUE TRUE TRUE TRUE FALSE TRUE
[521] TRUE TRUE TRUE TRUE TRUE FALSE TRUE FALSE
```

```
[531] TRUE TRUE FALSE TRUE TRUE TRUE FALSE TRUE TRUE FALSE
[541] TRUE FALSE TRUE TRUE FALSE TRUE FALSE FALSE TRUE TRUE
[551] TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE TRUE TRUE
[561] FALSE TRUE TRUE TRUE TRUE TRUE FALSE TRUE FALSE TRUE
[571] FALSE TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE FALSE
[581] FALSE FALSE TRUE FALSE TRUE TRUE TRUE FALSE TRUE TRUE
[591] TRUE FALSE TRUE TRUE FALSE TRUE TRUE FALSE TRUE TRUE
[601] TRUE TRUE TRUE TRUE FALSE TRUE FALSE TRUE TRUE TRUE
[611] TRUE TRUE FALSE TRUE TRUE FALSE TRUE FALSE
[621] FALSE TRUE TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE
[631] FALSE TRUE TRUE TRUE TRUE FALSE TRUE FALSE TRUE TRUE
[651] FALSE TRUE TRUE TRUE FALSE FALSE TRUE TRUE TRUE FALSE
[661] FALSE TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE
[671] TRUE TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE
[681] TRUE FALSE FALSE TRUE TRUE TRUE TRUE TRUE TRUE
[701] TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE TRUE TRUE
[711] TRUE TRUE TRUE TRUE TRUE TRUE TRUE FALSE TRUE TRUE
[721] TRUE TRUE FALSE TRUE TRUE FALSE TRUE TRUE TRUE
[731] FALSE TRUE FALSE TRUE TRUE FALSE FALSE TRUE TRUE FALSE
[751] TRUE TRUE TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE
[771] FALSE TRUE FALSE TRUE TRUE TRUE TRUE TRUE FALSE TRUE
[781] FALSE TRUE TRUE FALSE TRUE TRUE TRUE TRUE FALSE FALSE
[791] TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE TRUE
[801] TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE
[811] TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE TRUE TRUE
[821] TRUE TRUE FALSE TRUE TRUE TRUE TRUE TRUE TRUE TRUE
[841] TRUE TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE TRUE
[851] TRUE FALSE TRUE TRUE TRUE FALSE TRUE TRUE FALSE TRUE
```

> # ----test dataset---

> test<- vg[partition==2, ]

> partition==2 # here we will get just the opposite of the train set

[1] FALSE FALSE TRUE TRUE FALSE FALSE TRUE FALSE FALSE TRUE
[11] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE
[21] FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE TRUE
[31] TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
[41] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE
[51] FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE FALSE
[61] FALSE FALSE FALSE FALSE FALSE TRUE TRUE FALSE FALSE
[71] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
[81] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
[101] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
[101] FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE
[111] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
[121] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
[131] TRUE FALSE FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE

[141] FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE TRUE [151] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE [161] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE [171] FALSE TRUE FALSE FALSE FALSE FALSE TRUE FALSE TRUE [181] FALSE FALSE FALSE FALSE FALSE FALSE TRUE TRUE FALSE [191] FALSE TRUE FALSE TRUE FALSE FALSE FALSE FALSE FALSE [201] TRUE FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE [211] FALSE FALSE FALSE FALSE FALSE FALSE TRUE TRUE FALSE [221] TRUE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE [231] FALSE FALSE FALSE FALSE FALSE TRUE FALSE TRUE FALSE [241] FALSE FALSE FALSE FALSE FALSE TRUE TRUE FALSE FALSE [251] FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE TRUE [261] TRUE FALSE TRUE FALSE FALSE FALSE FALSE FALSE TRUE [271] FALSE FALSE FALSE FALSE TRUE FALSE FALSE FALSE [281] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE [291] FALSE FALSE TRUE FALSE TRUE TRUE FALSE FALSE FALSE [301] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE [311] FALSE FALSE FALSE TRUE TRUE FALSE FALSE TRUE TRUE [321] FALSE FALSE FALSE FALSE TRUE FALSE TRUE FALSE [331] FALSE FALSE TRUE FALSE FALSE FALSE FALSE TRUE FALSE [341] FALSE FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE [351] TRUE FALSE FALSE TRUE FALSE FALSE FALSE TRUE FALSE [361] FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE [371] FALSE TRUE FALSE FALSE TRUE FALSE FALSE TRUE FALSE [381] FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE TRUE [391] FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE TRUE [401] FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE [411] TRUE FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE [421] FALSE FALSE TRUE FALSE FALSE FALSE TRUE TRUE [431] FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE [441] FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE [451] FALSE FALSE FALSE TRUE TRUE FALSE FALSE TRUE [461] FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE

[471] TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE [481] TRUE FALSE FALSE TRUE FALSE FALSE FALSE TRUE TRUE [491] FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE [501] FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE FALSE [511] FALSE TRUE FALSE FALSE FALSE FALSE FALSE TRUE FALSE [521] FALSE FALSE FALSE FALSE TRUE FALSE TRUE FALSE TRUE [531] FALSE FALSE TRUE FALSE FALSE TRUE FALSE TRUE [541] FALSE TRUE FALSE FALSE TRUE FALSE TRUE TRUE FALSE FALSE [551] FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE [561] TRUE FALSE FALSE FALSE FALSE TRUE FALSE TRUE FALSE [571] TRUE FALSE FALSE TRUE FALSE FALSE FALSE FALSE TRUE [581] TRUE TRUE FALSE TRUE FALSE FALSE FALSE TRUE FALSE FALSE [591] FALSE TRUE FALSE FALSE TRUE FALSE FALSE TRUE FALSE FALSE [601] FALSE FALSE FALSE TRUE FALSE TRUE FALSE FALSE FALSE [611] FALSE FALSE TRUE FALSE TRUE FALSE TRUE FALSE TRUE [621] TRUE FALSE FALSE FALSE FALSE TRUE FALSE FALSE FALSE [631] TRUE FALSE FALSE FALSE TRUE FALSE TRUE FALSE FALSE [641] FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE [651] TRUE FALSE FALSE TRUE TRUE FALSE FALSE TRUE [661] TRUE FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE [671] FALSE FALSE FALSE FALSE TRUE FALSE FALSE FALSE [681] FALSE TRUE TRUE TRUE FALSE FALSE FALSE FALSE FALSE [691] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE [701] FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE [711] FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE FALSE [721] FALSE FALSE TRUE FALSE FALSE TRUE FALSE FALSE FALSE [731] TRUE FALSE TRUE FALSE FALSE TRUE TRUE FALSE FALSE TRUE [741] FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE [751] FALSE FALSE FALSE FALSE FALSE TRUE FALSE FALSE FALSE [761] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE [771] TRUE FALSE TRUE FALSE FALSE FALSE FALSE TRUE FALSE [781] TRUE FALSE FALSE TRUE FALSE FALSE FALSE TRUE TRUE [791] FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE

```
[801] FALSE FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE
[811] FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE
[821] FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE
[831] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE
[841] FALSE FALSE FALSE FALSE TRUE FALSE FALSE FALSE
[851] FALSE TRUE FALSE FALSE FALSE TRUE FALSE FALSE TRUE FALSE
[861] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
[871] FALSE FALSE TRUE FALSE FALSE FALSE TRUE FALSE FALSE
[881] TRUE FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE
[891] FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE TRUE
[901] FALSE TRUE FALSE FALSE FALSE TRUE TRUE FALSE FALSE
[911] FALSE TRUE FALSE FALSE TRUE FALSE FALSE FALSE TRUE
[921] FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE TRUE
[931] FALSE FALSE TRUE FALSE TRUE TRUE TRUE FALSE TRUE
[941] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
[951] FALSE TRUE FALSE FALSE TRUE FALSE FALSE FALSE FALSE
[961] FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE
[971] FALSE TRUE FALSE FALSE TRUE FALSE FALSE FALSE
[981] FALSE TRUE FALSE TRUE FALSE FALSE FALSE FALSE FALSE
[991] FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE
[ reached getOption("max.print") -- omitted 6112 entries ]
> # training dataset has 5685 observations with 9 variables
> # test dataset has 1427 observations with 9 variables
>
> model7 <- lm(EU_Sales~ .,data= train)
>
> prediction <- predict(model7,test)
> prediction # these all the predictions of the observations in the test data
```

3

7

10

15

19

```
1.09e+01 9.15e+00 7.48e+00 8.48e+00 5.49e+00 3.70e+00
   20
         23
                30
                       31
                             49
                                    58
5.73e+00 6.77e+00 2.81e+00 2.37e-02 2.43e+00 2.08e+00
   64
         66
                67
                      86
                             87
                                    88
2.36e+00 3.42e+00 2.11e+00 4.24e+00 1.80e+00 2.53e+00
  103
         105
                106
                        110
                             113
                                      117
1.83e+00 1.19e-03 2.20e+00 6.50e-01 2.07e+00 1.63e+00
  125
         131
                136
                        138
                               144
                                      150
2.24e+00 1.09e+00 2.43e+00 2.18e+00 3.28e+00 1.00e+00
  172
         178
                180
                        188
                               189
                                      192
9.10e-01 1.28e+00 1.03e+00 1.12e+00 1.12e-02 1.01e+00
         201
                205
                               219
  194
                       218
                                      221
2.29e+00 1.93e+00 2.18e+00 1.36e+00 6.60e-01 1.93e+00
  229
         237
                239
                                      259
                        247
                               248
1.56e+00 1.21e+00 1.08e+00 6.60e-01 1.01e+00 1.42e+00
         261
                263
                        270
                               276
                                      293
  260
2.35e+00 1.01e+00 1.02e+00 9.70e-01 2.28e+00 3.10e-01
  295
         296
                315
                        316
                               319
                                      320
2.30e+00 1.94e+00 8.11e-01 2.90e-01 9.80e-01 1.01e+00
  326
         329
                333
                        339
                               346
                                      351
1.04e+00 1.06e+00 1.19e+00 1.37e+00 7.80e-01 8.60e-01
  355
         359
                362
                        372
                               375
                                      379
1.13e+00 6.30e-01 9.03e-02 1.13e+00 7.70e-01 1.19e+00
  385
         390
                399
                        400
                               402
                                      411
6.40e-01 5.10e-01 7.30e-01 4.70e-01 1.40e-01 1.05e+00
         424
                429
  416
                        430
                               433
                                      444
1.02e+00 8.30e-01 2.03e-02 5.30e-01 8.40e-01 6.10e-01
  455
         456
                460
                        469
                               471
                                      481
```

1.31e+00 6.90e-01 1.02e-02 7.10e-01 4.30e-01 1.21e+00

5.40e-01 6.02e-02 6.00e-01 8.10e-01 2.02e-02 2.50e-01

1.46e+00 6.70e-01 4.60e-01 3.70e-01 3.10e-01 3.10e-01

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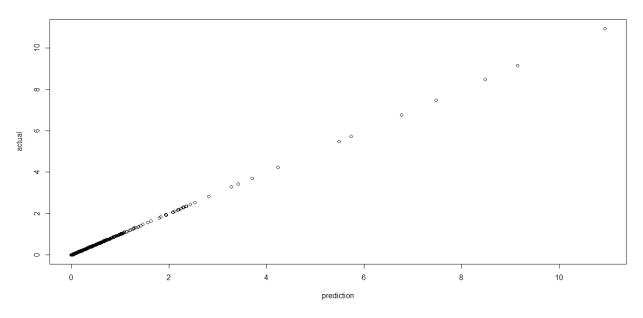
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           5021
                    5027
                             5035
4.96e-02 4.97e-02 -2.79e-04 6.97e-02
[ reached getOption("max.print") -- omitted 405 entries ]
>
> # Actual EU_Sales can be identified
> actual = test$EU_Sales
>
> # corellation between the actual and predicted value of EU_Sales
> cor(prediction,actual)
[1] 1
> par(mfrow = c(1,1))
> plot(prediction,actual)
> # the plot looks very good
```



# ---- Cross Validation-----

# K-fold cross validation to do that we have to use the DAAG package

```
install.packages('DAAG')
library(DAAG)
# cross validation linear model
#Performed 3 fold cross validations
out<- cv.lm(data=vg, form.lm = formula(EU_Sales~.), plotit = "Observed", m= 3)
#results for first fold
# Sum of squares = 0.09 Mean square = 0 n = 2370
#results for second fold
#Sum of squares = 0.08 Mean square = 0 n = 2371
#results for third fold
# Sum of squares = 10362 Mean square = 4.37 n = 2371
# Avg mean squre error
```

# 1.46

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6128	6129	6132	6136	6141	6145	
6155	6158	6176	6177	6178	6179	
6183	6185	6186	6188	6190	6196	
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6273	6277	6286	6289	6291	6294	
6295	6297	6298	6299	6301	6309	
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6354	6358	6359	636	636	3	
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6604	6605	6606	6610	6619	6620
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6648	6652	6653	6659	6663	6665
6667	6669	6670	6674	6675	6676
6681	6684	6686	6688	6696	
6699	6700	6701	6702	6703	
6704	6705	6707	6712	6714	
6716	6717	6721	6724	6725	6727
6730	6731	6733	6737	6739	
6754	6756	6757	6760	676	2
6763	6764	6767	6772	6778	6781
6788	6792	6793	6795	6797	
6799	6805	6810	6812	6816	6817
6830	6831	6837	6840	6842	6847
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7038	7041	7044	7048	7049	
7051	7054	7058	7059	7065	
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7083	7088	7090	7094	7097	
7100	7102	7103	7105	7107	7110

Sum of squares = 0.09 Mean square = 0 n = 2370

fold 2 Observations in test set: 2371

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145	146	147	1	51	152	2	156
157	158	159	9	161	167	7	172
179	180	18	1	182	18	34	
18	5 187	190	) 1	91	192	2 1	95
207	208	209	2	210	21	4	216
219	220	) 22	24	225	22	27	231
233	236	23	7	242	24	16	247
249	250	25	2	253	2	58	
259	269	2	71	276	2	81	
282	284	287	•	288	29	0	293
298	300	301	3	03	305	5	306
308	30	9 3	11	312	31	7	318
334	335	3	36	337	33	9	342
348	355	356	6 3	858	37	3	374
377	378	381	384	38	9	391	
393	3 397	39	8	400	403	4	107
409	412	41	5 4	22	424	4	26
429	9 43	0 432	2	434	435	5	437
438	439	) 44	.1	443	44	4	445

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5733	5734	5736	5743	5744	
5746	5747	5751	5757	5762	
5765	5770	5771	5779	5781	5782
5785	5790	5792	5795	5800	
5801	5807	5808	5810	5811	5818
5820	5821	5824	5825	5826	5830
5833	5839	5840	5841	5847	5848
5849	5852	5854 5	856 5	858 58	59
5861	5866	5876	5877	5879	5880
5882	5883	5886	5888	5889	5891
5892	5893	5894	5898	5899 5	5905
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6135	6137	6138	6140	6143	
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```

[ reached getOption("max.print") -- omitted 4 rows ]

Sum of squares = 0.08 Mean square = 0 n = 2371

fold 3
Observations in test set: 2371

39 42 82 89 

- 104 105 107 109 110 112 115 116 117 118 119 120 122 124 127 133 135 139 140 142 144 148 153 154 160 162 165 174 177 178 186 194 197 199 200 202 203 211 213 215 222 223 228 229 230 235 240 243 251 255 261 263 264 265 270 278 283 285 291 295 297 302 313 314 316 321 328 330 332 333 338 343 346 351 352 353 354 359 361 362 364 368 369 370 376 383 385 386 387 388 394 395 399 404 408 410 411 416 418 419 420 421 423 427 428 417 436 442 457 458 467 469 471 473 475 476 484 485 486 488 490 493 498 505 506 508 512 518 519 522 524 526 528 531 532 542 543 546 548 550 551 553 555 556 561
- 582 584 589 590 593 597 598 602 604 606 609 614 619 623 625 630 631 633 639 641 643 644 647 650 652 656 658 659 661 663 664 665 669

575

568 569 571 573

565

587

- 673 674 675 678 680 681 682 685 694 695 697 700 701 706 710 711 712 713 715 722 724 730 731 737 738
- 740 746 747 755 756 760 761 762
- 763 764 774 776 777 782 786 791
- 792 800 808 809 811 813 816 820
- 822 829 831 834 836 840 841 845
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- 4300 4303 4306 4312 4318 4321 4324
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- 4651 4652 4655 4657 4658 4665
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- 4680 4681 4687 4689 4694 4701
- 4705 4706 4707 4709 4710 4712
- 4719 4723 4729 4734 4735 4739
- 4743 4746 4747 4750 4752 4753
- 4755 4762 4763 4766 4770 4773
- 4774 4779 4786 4789 4794 4795
- 4796 4797 4799 4808 4809 4811
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- 4838 4847 4853 4858 4860 4862
- 4863 4866 4876 4886 4888 4891

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                            6916
                                   6922
6926
       6933
               6934
                      6936
                             6939
                                    6940
6941
        6946
                6947
                       6948
                               6949
6951
        6952
               6956
                      6959
                             6960
                                    6961
6962
        6968
               6969
                      6971
                              6972
6976
       6977
              6978
                      6979
                             6980
                                    6991
6998
        7001
                       7004
                               7005
               7002
7007
       7008
              7012
                      7014
                             7016 7017
7019
               7024
                       7025
                              7026
       7020
7029
        7033
               7039
                       7040
                              7043
7045
       7050
               7052
                      7056
                             7057
7064
       7066
               7068
                      7069
                             7072
7073
       7077
              7078
                      7080
                             7084
7089
        7092
               7095
                      7098
                             7101
                                    7104
7106
       7108
              7111
```

[ reached getOption("max.print") -- omitted 4 rows ]

Sum of squares = 10362 Mean square = 4.37 n = 2371

```
Overall (Sum over all 2371 folds)
ms

1.46

Warning messages:

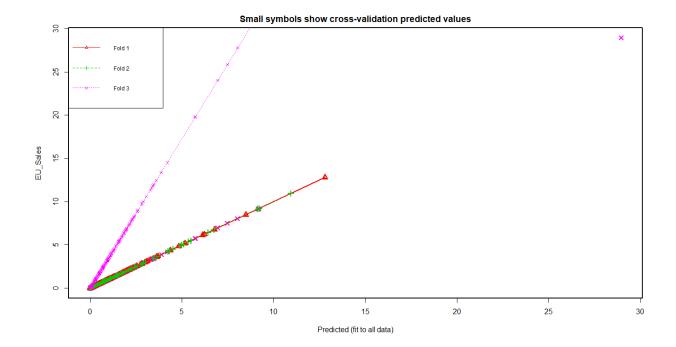
1: In predict.lm(subs.lm, newdata = data[rows.out, ]):
prediction from a rank-deficient fit may be misleading

2: In predict.lm(subs.lm, newdata = data[rows.out, ]):
prediction from a rank-deficient fit may be misleading

3: In predict.lm(subs.lm, newdata = data[rows.out, ]):
prediction from a rank-deficient fit may be misleading

4: In cv.lm(data = vg, form.lm = formula(EU_Sales ~ .), plotit = "Observed", :

As there is >1 explanatory variable, cross-validation
predicted values for a fold are not a linear function
of corresponding overall predicted values. Lines that
are shown for the different folds are approximate
```



#----Stepwise Regression-----

install.packages("MASS")
library(MASS)

#AIC - stepwise Algorithum

#====Backword Elimination ======

```
> vg <- Videogames[,-c(1,2,3,4,5,15)]
>
> model_full<- Im(EU_Sales~., data= vg)
>
> step<- stepAIC(model_full, direction = "backward")
Start: AIC=-72908
EU_Sales ~ NA_Sales + JP_Sales + Other_Sales + Global_Sales +</pre>
```

## Critic\_Score + Critic\_Count + User\_Score + User\_Count

# Df Sum of Sq RSS AIC

- Critic\_Score 1 0 0 -72910
- User\_Score 1 0 0 -72910
- Critic\_Count 1 0 0 -72910
- User\_Count 1 0 0 -72909
- <none> 0 -72908
- Other\_Sales 1 141 141 -27879
- JP\_Sales 1 217 217 -24791
- NA\_Sales 1 349 349 -21418
- Global\_Sales 1 818 818 -15361

## Step: AIC=-72910

## Df Sum of Sq RSS AIC

- User\_Score 1 0 0 -72912
- Critic\_Count 1 0 0 -72912
- User\_Count 1 0 0 -72911
- <none> 0 -72910
- Other\_Sales 1 141 141 -27881
- JP\_Sales 1 217 218 -24788
- NA\_Sales 1 349 349 -21419
- Global\_Sales 1 819 819 -15360

#### Step: AIC=-72912

## Df Sum of Sq RSS AIC

- Critic\_Count 1 0 0 -72914

- User\_Count 1 0 0 -72913

<none> 0 -72912

- Other\_Sales 1 141 141 -27881

- JP\_Sales 1 220 220 -24713

- NA\_Sales 1 350 350 -21398

- Global\_Sales 1 821 821 -15340

Step: AIC=-72914

EU\_Sales ~ NA\_Sales + JP\_Sales + Other\_Sales + Global\_Sales + User\_Count

### Df Sum of Sq RSS AIC

- User\_Count 1 0 0 -72914

<none> 0 -72914

- Other\_Sales 1 141 141 -27879

- JP\_Sales 1 220 220 -24695

- NA\_Sales 1 351 352 -21377

- Global\_Sales 1 821 822 -15340

Step: AIC=-72914

EU\_Sales ~ NA\_Sales + JP\_Sales + Other\_Sales + Global\_Sales

#### Df Sum of Sq RSS AIC

<none> 0 -72914

- Other\_Sales 1 141 141 -27879

- JP\_Sales 1 225 225 -24549

- NA Sales 1 355 355 -21314

- Global\_Sales 1 839 839 -15189

> step\$anova # Display results

Stepwise Model Path

Analysis of Deviance Table

Initial Model:

```
EU_Sales ~ NA_Sales + JP_Sales + Other_Sales + Global_Sales +
Critic_Score + Critic_Count + User_Score + User_Count
```

#### Final Model:

EU\_Sales ~ NA\_Sales + JP\_Sales + Other\_Sales + Global\_Sales

## Step Df Deviance Resid. Df Resid. Dev AIC

```
1 7103 0.250 -72908
2 - Critic_Score 1 4.27e-07 7104 0.250 -72910
3 - User_Score 1 1.47e-06 7105 0.250 -72912
4 - Critic_Count 1 1.46e-05 7106 0.250 -72914
5 - User_Count 1 5.24e-05 7107 0.251 -72914
```

>

- > #Checking empty and full models
- > model\_full<- lm(EU\_Sales~., data= vg)
- > model\_empty<- lm(EU\_Sales~ 1, data=vg)

>

> summary(model\_empty) # The empty model has only one yinterscept

## Call:

Im(formula = EU\_Sales ~ 1, data = vg)

#### Residuals:

Min 1Q Median 3Q Max -0.233 -0.213 -0.173 -0.030 28.727

#### Coefficients:

Estimate Std. Error t value Pr(>|t|)
(Intercept) 0.23254 0.00806 28.8 <2e-16 \*\*\*
--Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.68 on 7111 degrees of freedom

+ User\_Score 1 2.5 390 -20647

```
>
> # Now we will do forward
>
> step<- stepAIC(model_empty, direction = "forward", scope = list(upper= model_full,
lower= model_empty))
Start: AIC=-5484
EU_Sales ~ 1
        Df Sum of Sq RSS AIC
+ Global_Sales 1 2896 392 -20604
+ NA_Sales
             1
                 2310 978 -14107
+ Other_Sales 1 1696 1592 -10641
+ JP_Sales
            1
                 884 2404 -7709
+ User_Count 1 266 3022 -6082
                 236 3053 -6011
+ Critic_Count 1
+ Critic_Score 1 148 3141 -5809
+ User Score 1
                 10 3278 -5504
                  3288 -5484
<none>
Step: AIC=-20604
EU_Sales ~ Global_Sales
        Df Sum of Sq RSS AIC
+ NA_Sales
             1 125.3 267 -23339
            1 16.3 376 -20904
+ JP_Sales
+ Other_Sales 1 13.2 379 -20846
+ User_Count 1 4.5 388 -20684
```

+ Critic\_Score 1 0.4 392 -20609

+ Critic\_Count 1 0.2 392 -20605

<none> 392 -20604

Step: AIC=-23339

EU\_Sales ~ Global\_Sales + NA\_Sales

## Df Sum of Sq RSS AIC

+ JP Sales 1 126.0 141 -27879

+ Other\_Sales 1 41.8 225 -24549

+ User\_Count 1 3.4 264 -23429

+ User\_Score 1 2.3 265 -23399

+ Critic\_Score 1 0.1 267 -23341

<none> 267 -23339

+ Critic\_Count 1 0.0 267 -23339

Step: AIC=-27879

EU\_Sales ~ Global\_Sales + NA\_Sales + JP\_Sales

## Df Sum of Sq RSS AIC

+ Other\_Sales 1 140.7 0.3 -72914

+ User Score 1 0.1 140.9 -27881

+ Critic\_Count 1 0.0 140.9 -27879

<none> 140.9 -27879

+ User\_Count 1 0.0 140.9 -27879

+ Critic\_Score 1 0.0 140.9 -27879

Step: AIC=-72914

EU\_Sales ~ Global\_Sales + NA\_Sales + JP\_Sales + Other\_Sales

#### Df Sum of Sq RSS AIC

<none> 0.250 -72914

+ User\_Count 1 5.24e-05 0.250 -72914

- + Critic\_Count 1 3.47e-05 0.250 -72913
- + Critic\_Score 1 8.20e-06 0.250 -72913
- + User\_Score 1 3.90e-06 0.250 -72913
- > summary(step)

#### Call:

Im(formula = EU\_Sales ~ Global\_Sales + NA\_Sales + JP\_Sales +
Other\_Sales, data = vg)

#### Residuals:

Min 1Q Median 3Q Max -0.020098 0.000147 0.000228 0.000244 0.020221

#### Coefficients:

Estimate Std. Error t value Pr(>|t|)
(Intercept) -2.43e-04 7.61e-05 -3.2 0.0014 \*\*
Global\_Sales 1.00e+00 2.05e-04 4879.1 <2e-16 \*\*\*
NA\_Sales -1.00e+00 3.15e-04 -3171.2 <2e-16 \*\*\*
JP\_Sales -1.00e+00 3.96e-04 -2525.6 <2e-16 \*\*\*
Other\_Sales -1.00e+00 5.00e-04 -1997.8 <2e-16 \*\*\*
--Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.00594 on 7107 degrees of freedom

Multiple R-squared: 1, Adjusted R-squared: 1

F-statistic: 2.33e+07 on 4 and 7107 DF, p-value: <2e-16