615 final project

Xiangliang Liu
December 9, 2018

Introduction:

Watching movie is always a good recreation for people who live under a stressful life style. However, we are constantly facing fake revenue record regarding to the newly released movie. This project will mainly focus on exploring some fundamental information about 5000 movies in the dataset called "The Movie Data Base". Specifically, we will conduct Benford analysis on Budget, revenue and popularity variables in the dataset. Then we will find out which variable does not follow Benford distribution and the reason behind it.

Data visualization and EDA:

```
##
        budget
                            genres
                                                   id
                                                                 popularity
##
                         Length: 3229
                                                                      : 0.02
    Min.
                                             Min.
                                                           5
                                                               Min.
    1st Qu.: 10500000
                         Class : character
                                             1st Qu.:
                                                       4958
                                                               1st Qu.: 10.45
    Median: 25000000
                                                               Median : 20.41
##
                         Mode :character
                                             Median : 11451
           : 40654445
                                                                      : 29.03
##
    Mean
                                             Mean
                                                    : 44781
                                                               Mean
##
    3rd Qu.: 55000000
                                             3rd Qu.: 45272
                                                               3rd Qu.: 37.34
           :380000000
                                                    :417859
                                                                      :875.58
##
    Max.
                                             Max.
                                                               Max.
##
       title
                        production_companies production_countries
##
   Length: 3229
                        Length: 3229
                                              Length: 3229
    Class :character
                        Class :character
                                              Class : character
##
##
    Mode :character
                        Mode :character
                                              Mode :character
##
##
##
##
                          vote_average
                                            vote_count
       revenue
##
           :5.000e+00
                                :0.000
##
    1st Qu.:1.700e+07
                         1st Qu.:5.800
                                          1st Qu.:
                                                    178.0
##
    Median :5.518e+07
                         Median :6.300
                                          Median:
                                                    471.0
##
    Mean
           :1.212e+08
                                :6.309
                                         Mean
                                                : 977.3
                         Mean
    3rd Qu.:1.463e+08
                         3rd Qu.:6.900
                                          3rd Qu.: 1148.0
           :2.788e+09
                                                 :13752.0
##
    Max.
                         Max.
                                :8.500
                                         Max.
```

EDA

Check the distribution plot with variable budget, revenue, popularity and number of counts.

```
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
```

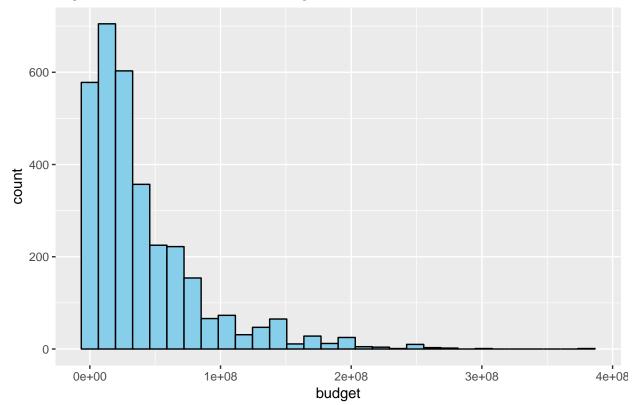


Figure 1. The distribution of budget

`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.

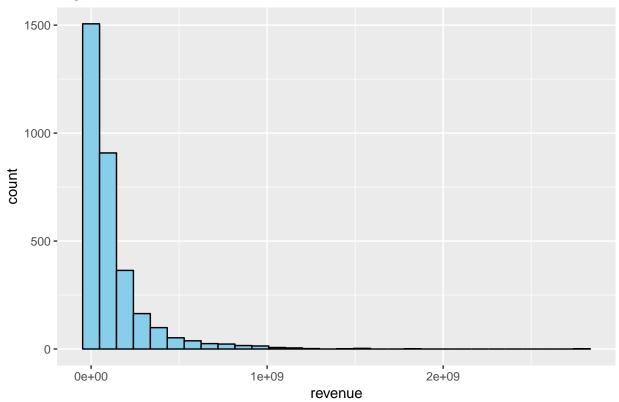


Figure 2.The distribution of revenue

`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.

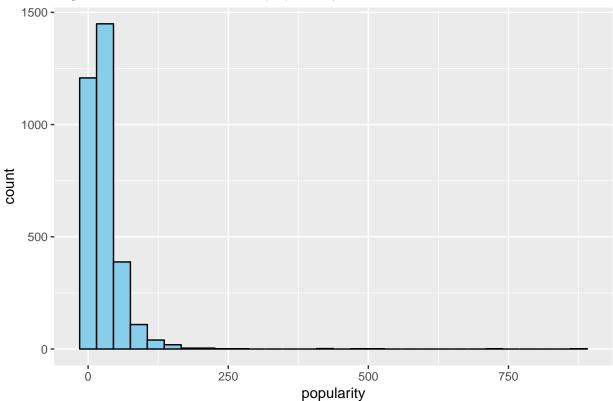


Figure 3.The distribution of popularity

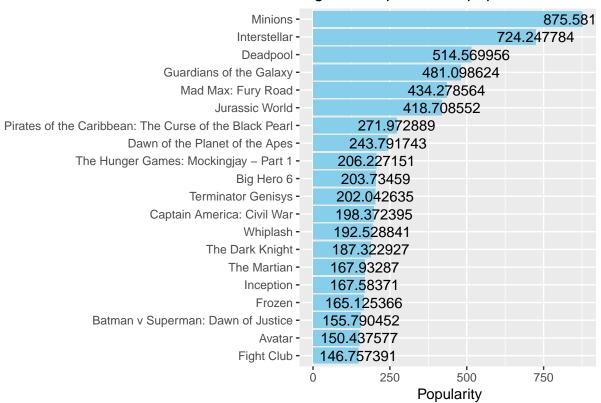
`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.

1000 - 750 - 250 - 250 - 10000 vote_count

Figure 4.The distribution of number of vote

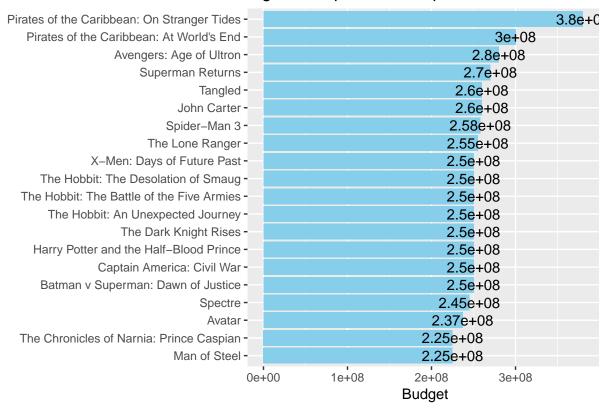
Most popular movies in the dataset

Figure 5.Top 20 most popular movie



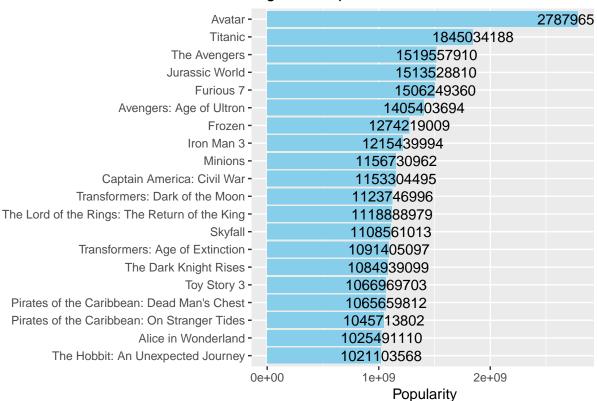
Most expensive movies in the dataset

Figure 6.Top 20 most expensive movie



Most lucrative movies in the dataset

Figure 7.Top 20 most lucrative movie



The plot showing above indicates the top 20 most popular movie in the movie data base. The movie Minions is the movie with biggest popularity

Create a genre wordcloud

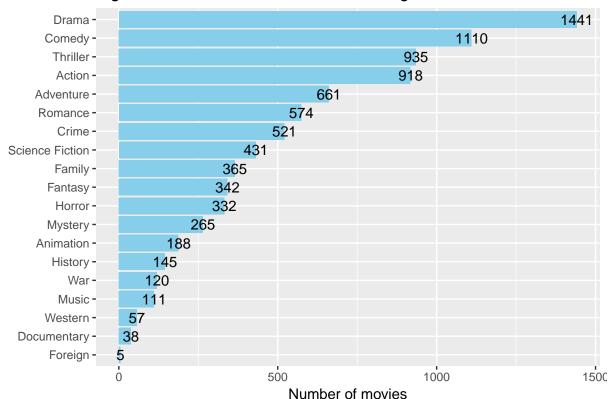


Figure 8. Number of movies in different genres

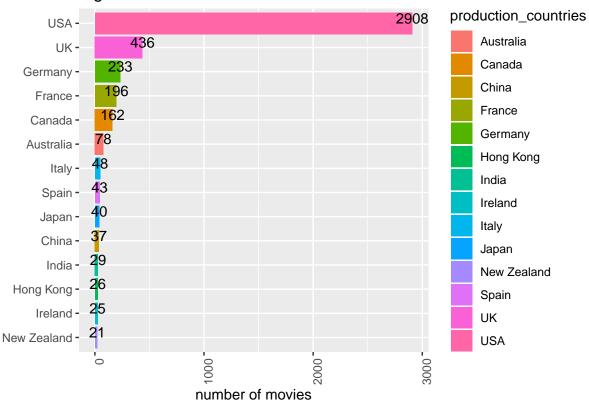


The wordclouds gives us a general idea about which genres have the largest proportion. It turns out that Drama, Comedy and Thriller are the top 3 genres with highest number of movies

mapping with production countries

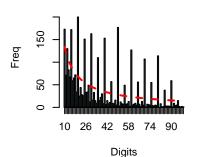
```
##
## Attaching package: 'maps'
## The following object is masked from 'package:purrr':
##
## map
```

Figure 9.the distribution of movies in different countries

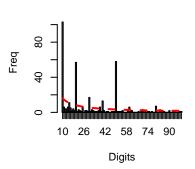




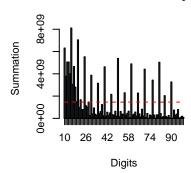




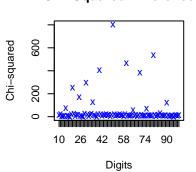
Digits Distribution Second Order Test



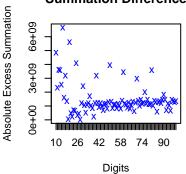
Summation Distribution by



Chi-Squared Difference



Summation Difference



Legend Dataset: movie\$budge



##Bnford analysis:

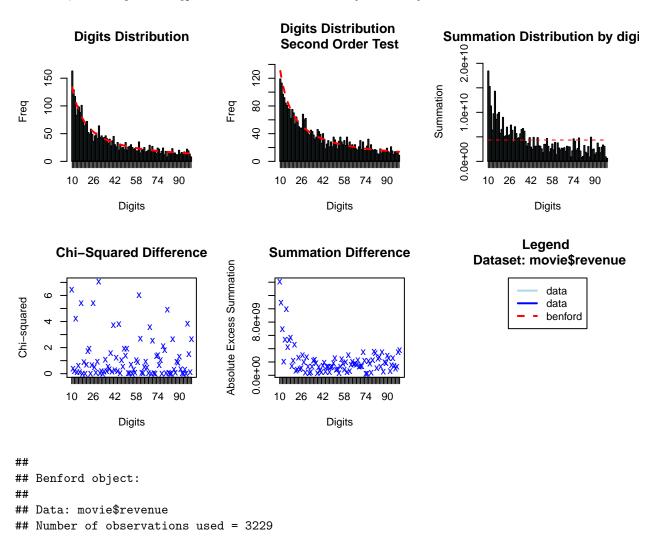
```
##
## Benford object:
##
## Data: movie$budget
## Number of observations used = 3229
   Number of obs. for second order = 384
## First digits analysed = 2
##
  Mantissa:
##
##
##
      Statistic Value
##
           Mean 0.481
##
            Var
                 0.081
##
    Ex.Kurtosis -1.174
##
       Skewness -0.015
##
##
## The 5 largest deviations:
##
     digits absolute.diff
##
## 1
         50
                    149.23
## 2
         20
                    131.58
```

3 40 118.37 ## 4 30 117.02 ## 5 60 103.82

```
## Stats:
##
    Pearson's Chi-squared test
##
##
##
  data: movie$budget
  X-squared = 4686, df = 89, p-value < 2.2e-16
##
##
##
##
    Mantissa Arc Test
##
##
  data: movie$budget
  L2 = 0.00048393, df = 2, p-value = 0.2096
##
##
## Mean Absolute Deviation: 0.008913238
  Distortion Factor: -4.976945
##
```

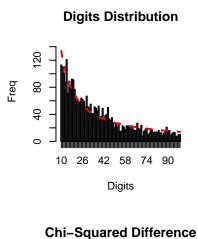
Remember: Real data will never conform perfectly to Benford's Law. You should not focus on p-values!

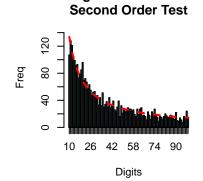
as we can see from the distribution and summary of the Benfore test, the budget data in movie dose not follow Benford distribution. A lot of lines exceed the red line threshold. Also, the p-value in the summary is less than 0.05, which reject the hypothesis that the distribution follow Benford distribution.



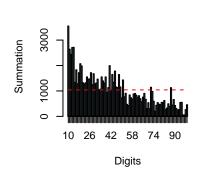
```
## Number of obs. for second order = 3153
## First digits analysed = 2
##
## Mantissa:
##
##
      Statistic Value
##
           Mean 0.493
            Var 0.086
##
##
    Ex.Kurtosis -1.214
##
       Skewness 0.015
##
##
## The 5 largest deviations:
##
##
     digits absolute.diff
## 1
         10
                    29.34
## 2
         13
                    20.92
## 3
         17
                    20.84
## 4
         30
                    18.02
                    16.92
## 5
         26
##
## Stats:
##
## Pearson's Chi-squared test
##
## data: movie$revenue
## X-squared = 105.71, df = 89, p-value = 0.1092
##
##
## Mantissa Arc Test
##
## data: movie$revenue
## L2 = 0.00038072, df = 2, p-value = 0.2925
## Mean Absolute Deviation: 0.00153106
## Distortion Factor: -0.9888538
##
## Remember: Real data will never conform perfectly to Benford's Law. You should not focus on p-values!
```

The Benford test on revenue indicates p-value is 0.2925 > 0.05, so do not reject the hypothesis that the distribution follow Benford distribution. This is result is what

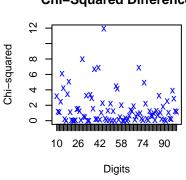


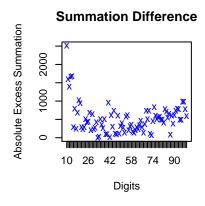


Digits Distribution



Summation Distribution by digi







```
##
## Benford object:
##
## Data: movie$popularity
## Number of observations used = 3229
   Number of obs. for second order = 3227
   First digits analysed = 2
##
##
   Mantissa:
##
      Statistic Value
##
##
           Mean
                 0.488
##
            Var
                 0.074
##
    Ex.Kurtosis -1.053
       Skewness 0.052
##
##
##
## The 5 largest deviations:
##
     digits absolute.diff
##
## 1
         14
                     24.25
## 2
         10
                     20.66
## 3
         15
                     19.50
## 4
         29
                     19.46
## 5
         45
                     19.18
```

##

```
## Stats:
##
##
   Pearson's Chi-squared test
##
## data: movie$popularity
## X-squared = 145.8, df = 89, p-value = 0.0001389
##
##
##
   Mantissa Arc Test
##
## data: movie$popularity
## L2 = 0.0086403, df = 2, p-value = 7.645e-13
## Mean Absolute Deviation: 0.001861221
## Distortion Factor: -20.41978
##
## Remember: Real data will never conform perfectly to Benford's Law. You should not focus on p-values!
      Min. 1st Qu.
                    Median
                              Mean 3rd Qu.
                                               Max.
      0.02
                     20.41
                              29.03
##
             10.45
                                      37.34
                                            875.58
```

As for the variable popularity, the p-values from Chi-squared test is 0.0001389, which is less than 0.05. So we do reject the hypothesis that the distribution follow Benford distribution

Conclusion:

insights and findings:

We found the budget numbers do not significantly follow Benford analysis. The budget that start with 50 and 20 have the highest deviation. This result does make sense, because when people decide to make a movie or approve a movie, they tends to give a rough number about how much money they will spend on this movie. They never specific the budget to a unit digit. For instant, the number could be 500 million or 200 million dollars. So the result of Benford analysis on variable budget is what we expected.

From the Benford analysis on variable revenue, we cannot reject the hypothesis that the distribution follow Benford distribution. However, though the number seems right, there's no evidence to draw the conclusion that there's no fraud in this variable. we may want to do more research on those movies.

limitation:

There are a few limitations about the Benford analysis. We can only test whether the data follow Benford distribution. After that, even if we know the data does not follow the distribution, we still need to do more research on the data to explore whether there are some frauds in the data. This limitation is also interpreted in the summary: "Real data will never conform perfectly to Benford's Law. You should not focus on p-values!"

Acknowledge:

Special thanks to professor Wright who give me advice to choose dataset. Thanks for his consistency in teaching data cleaning, data manipulation and all kinds of data visualization methods.

Reference:

https://www.kaggle.com/tmdb/tmdb-movie-metadata