

P2: Investigate a Dataset (tmdb.csv)

Introduction

Data Overview

-In the tmdb.csv contains information about 10,000 movies, in which including user ratings and revenue.

Questions:

- 1.Which movies had highest and lowest budgets?
- 2.Average runtime of all the movies
- 3.Movies with most and least earned revenue.
- 4.Movies with longest and shortest runtime values.
- 5.Year of release vs revenue earned.

Whit respect to Revenue earn by movies.

6. Successful genres
7. Most frequent cast
8. Average Budget
9. Average Duration
- 10.Year of release

```
In [1]: # Use this cell to set up import statements for all of the packages that you
        #      plan to use.

        # Remember to include a 'magic word' so that your visualizations are plotted
        #      inline with the notebook. See this page for more:
        #      http://ipython.readthedocs.io/en/stable/interactive/magics.html

        #importing important files
import pandas as pd
import numpy as np
import seaborn as sns
from datetime import datetime
import pprint
import matplotlib.pyplot as plt
%matplotlib inline
```

Data wrangling

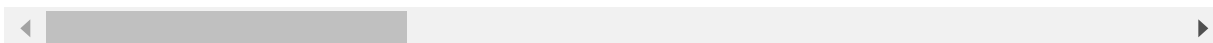
After observing the dataset and questions for analysis we are keeping only important data and deleting unused data so we can make our calculation easy and understandable.

```
In [2]: tmdb_data = pd.read_csv('tmdb-movies.csv')
tmdb_data.head()
```

Out[2]:

	id	imdb_id	popularity	budget	revenue	original_title	cast	
0	135397	tt0369610	32.985763	150000000	1513528810	Jurassic World	Chris Pratt Bryce Dallas Howard Irrfan Khan Vi...	
1	76341	tt1392190	28.419936	150000000	378436354	Mad Max: Fury Road	Tom Hardy Charlize Theron Hugh Keays-Byrne Nic...	
2	262500	tt2908446	13.112507	110000000	295238201	Insurgent	Shailene Woodley Theo James Kate Winslet Ansel...	http://www
3	140607	tt2488496	11.173104	200000000	2068178225	Star Wars: The Force Awakens	Harrison Ford Mark Hamill Carrie Fisher Adam D...	htt
4	168259	tt2820852	9.335014	190000000	1506249360	Furious 7	Vin Diesel Paul Walker Jason Statham Michelle ...	

5 rows × 21 columns



Obseervations from the data set

1. Some missing value in budeget and revenue column are zero.
2. No standar unit for currency is used in this dataset So, i am assuming the currency unit is dollar.

In [3]: `tmdb_data.info()`

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 10866 entries, 0 to 10865
Data columns (total 21 columns):
id                10866 non-null int64
imdb_id           10856 non-null object
popularity        10866 non-null float64
budget            10866 non-null int64
revenue           10866 non-null int64
original_title    10866 non-null object
cast              10790 non-null object
homepage          2936 non-null object
director          10822 non-null object
tagline           8042 non-null object
keywords          9373 non-null object
overview          10862 non-null object
runtime           10866 non-null int64
genres            10843 non-null object
production_companies 9836 non-null object
release_date      10866 non-null object
vote_count        10866 non-null int64
vote_average      10866 non-null float64
release_year      10866 non-null int64
budget_adj        10866 non-null float64
revenue_adj       10866 non-null float64
dtypes: float64(4), int64(6), object(11)
memory usage: 1.7+ MB
```

In [4]: `tmdb_data.shape`

Out[4]: (10866, 21)

In [5]: `tmdb_data.dtypes`

```
Out[5]: id                int64
imdb_id                object
popularity            float64
budget                int64
revenue               int64
original_title        object
cast                  object
homepage              object
director              object
tagline               object
keywords              object
overview              object
runtime               int64
genres                object
production_companies  object
release_date          object
vote_count            int64
vote_average          float64
release_year          int64
budget_adj            float64
revenue_adj           float64
dtype: object
```

In [6]: `tmdb_data.describe()`

```
Out[6]:
```

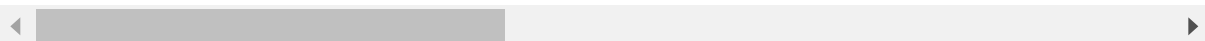
		id	popularity	budget	revenue	runtime	vote_count	vo
count	10866.000000	10866.000000	1.086600e+04	1.086600e+04	10866.000000	10866.000000	10	
mean	66064.177434	0.646441	1.462570e+07	3.982332e+07	102.070863	217.389748		
std	92130.136561	1.000185	3.091321e+07	1.170035e+08	31.381405	575.619058		
min	5.000000	0.000065	0.000000e+00	0.000000e+00	0.000000	10.000000		
25%	10596.250000	0.207583	0.000000e+00	0.000000e+00	90.000000	17.000000		
50%	20669.000000	0.383856	0.000000e+00	0.000000e+00	99.000000	38.000000		
75%	75610.000000	0.713817	1.500000e+07	2.400000e+07	111.000000	145.750000		
max	417859.000000	32.985763	4.250000e+08	2.781506e+09	900.000000	9767.000000		

In [7]: `tmdb_data.isna()`

Out[7]:

	id	imdb_id	popularity	budget	revenue	original_title	cast	homepage	director	tagline
0	False	False	False	False	False	False	False	False	False	False
1	False	False	False	False	False	False	False	False	False	False
2	False	False	False	False	False	False	False	False	False	False
3	False	False	False	False	False	False	False	False	False	False
4	False	False	False	False	False	False	False	False	False	False
...
10861	False	False	False	False	False	False	False	True	False	False
10862	False	False	False	False	False	False	False	True	False	False
10863	False	False	False	False	False	False	False	True	False	False
10864	False	False	False	False	False	False	False	True	False	False
10865	False	False	False	False	False	False	False	True	False	False

10866 rows × 21 columns



Data Cleaning

1. Check for missing data

In [8]: `tmdb_data.columns[tmdb_data.isnull().any()]`

Out[8]: Index(['imdb_id', 'cast', 'homepage', 'director', 'tagline', 'keywords',
'overview', 'genres', 'production_companies'],
dtype='object')

Based on the question, observation and the missing data i am going to remove the unued data such as id, imdb_id, homepage, production_companies, key words, homepage.

```
In [9]: #creating a list of columb to be deleted
del_col=['id', 'imdb_id', 'homepage', 'keywords', 'overview', 'production_companies']

#deleting the columns
tmdb_data= tmdb_data.drop(del_col,1)

#previewing the new dataset
tmdb_data.head(3)
```

Out[9]:

	popularity	budget	revenue	original_title	cast	director	tagline	runtime
0	32.985763	150000000	1513528810	Jurassic World	Chris Pratt Bryce Dallas Howard Irrfan Khan Vi...	Colin Trevorrow	The park is open.	124
1	28.419936	150000000	378436354	Mad Max: Fury Road	Tom Hardy Charlize Theron Hugh Keays-Byrne Nic...	George Miller	What a Lovely Day.	120
2	13.112507	110000000	295238201	Insurgent	Shailene Woodley Theo James Kate Winslet Ansel...	Robert Schwentke	One Choice Can Destroy You	119

2. Remove duplicates

```
In [10]: tmdb_data.drop_duplicates(inplace=True)
sum(tmdb_data.duplicated())
```

Out[10]: 0

In [11]: `tmdb_data.head(3)`

Out[11]:

	popularity	budget	revenue	original_title	cast	director	tagline	runtime
0	32.985763	150000000	1513528810	Jurassic World	Chris Pratt Bryce Dallas Howard Irrfan Khan Vi...	Colin Trevorrow	The park is open.	124
1	28.419936	150000000	378436354	Mad Max: Fury Road	Tom Hardy Charlize Theron Hugh Keays-Byrne Nic...	George Miller	What a Lovely Day.	120
2	13.112507	110000000	295238201	Insurgent	Shailene Woodley Theo James Kate Winslet Ansel...	Robert Schwentke	One Choice Can Destroy You	119

manipulating

```
In [12]: sep_list=['budget', 'revenue']
tmdb_data[sep_list] = tmdb_data[sep_list].replace(0, np.NaN)
tmdb_data.dropna(subset = sep_list, inplace = True)
rows, col = tmdb_data.shape
print('So after removing such entries, we now have only {} no.of movies.'.format(rows-1))
```

So after removing such entries, we now have only 3853 no.of movies.

4. Changing the release date column into standard date format

```
In [13]: tmdb_data.release_date = pd.to_datetime(tmdb_data['release_date'])
tmdb_data.head(3)
```

Out[13]:

	popularity	budget	revenue	original_title	cast	director	tagline	runtir
0	32.985763	150000000.0	1.513529e+09	Jurassic World	Chris Pratt Bryce Dallas Howard Irrfan Khan Vi...	Colin Trevorrow	The park is open.	1
1	28.419936	150000000.0	3.784364e+08	Mad Max: Fury Road	Tom Hardy Charlize Theron Hugh Keays-Byrne Nic...	George Miller	What a Lovely Day.	1
2	13.112507	110000000.0	2.952382e+08	Insurgent	Shailene Woodley Theo James Kate Winslet Ansel...	Robert Schwentke	One Choice Can Destroy You	1

5.Replacing zero with nan in runtime column

```
In [14]: tmdb_data['runtime'] =tmdb_data['runtime'].replace(0, np.NaN)
```

Exploratory Data Analysis

1. Which movies had highest and lowest budgets?


```
In [15]: #defining the function
def calculate(column):
    #for highest earned profit
    high= tmdb_data[column].idxmax()
    high_details=pd.DataFrame(tmdb_data.loc[high])

    #for lowest earned profit
    low= tmdb_data[column].idxmin()
    low_details=pd.DataFrame(tmdb_data.loc[low])

    #collectin data in one place
    info=pd.concat([high_details, low_details], axis=1)

    return info
calculate('budget')
```

Out[15]:

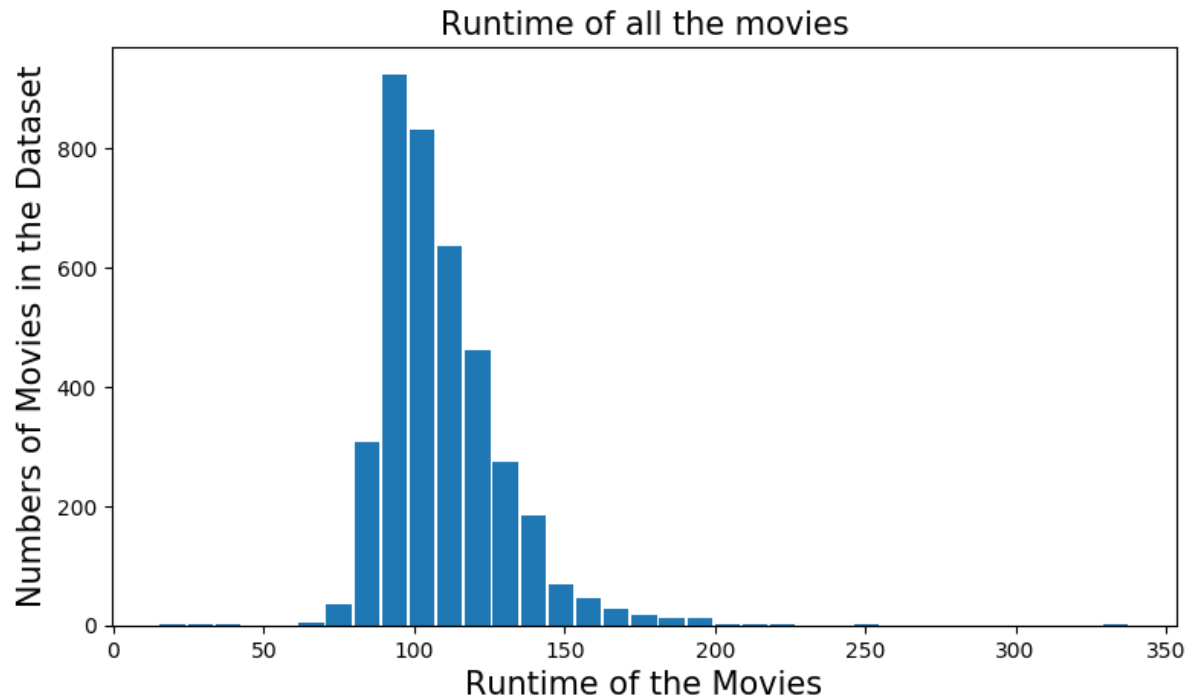
	2244	2618
popularity	0.25054	0.090186
budget	4.25e+08	1
revenue	1.10876e+07	100
original_title	The Warrior's Way	Lost & Found
cast	Kate Bosworth Jang Dong-gun Geoffrey Rush Dann...	David Spade Sophie Marceau Ever Carradine Step...
director	Sngmoo Lee	Jeff Pollack
tagline	Assassin. Hero. Legend.	A comedy about a guy who would do anything to ...
runtime	100	95
genres	Adventure Fantasy Action Western Thriller	Comedy Romance
release_date	2010-12-02 00:00:00	1999-04-23 00:00:00
vote_count	74	14
vote_average	6.4	4.8
release_year	2010	1999
budget_adj	4.25e+08	1.30905
revenue_adj	1.10876e+07	130.905

1. Average runtime of all the movies

```
In [16]: def avg_fun(column):
          return tmdb_data[column].mean()
avg_fun('runtime')
```

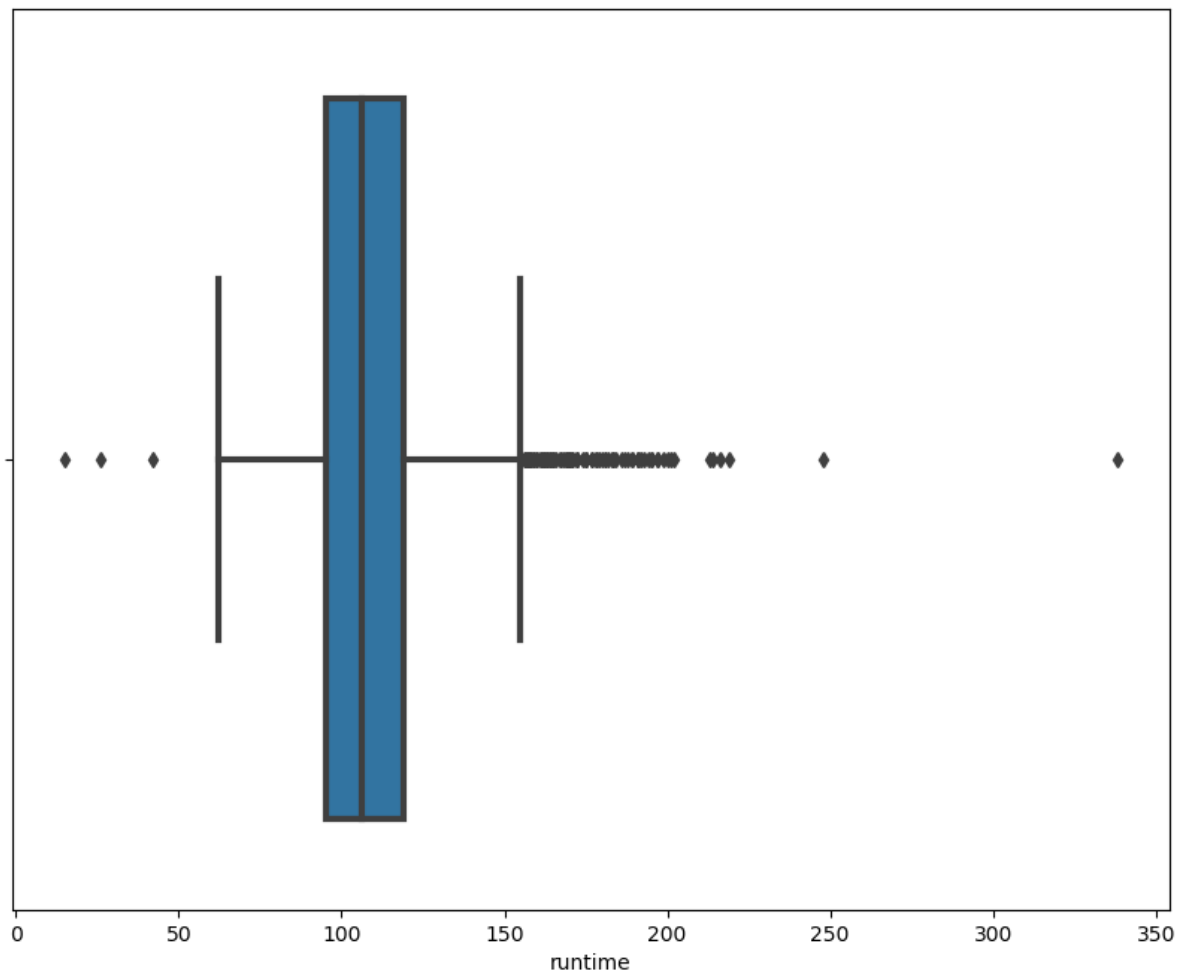
Out[16]: 109.22029060716139

```
In [17]: #plotting a histogram of runtime of movies
plt.figure(figsize=(9,5), dpi = 100)
plt.xlabel('Runtime of the Movies', fontsize = 15)
plt.ylabel('Numbers of Movies in the Dataset', fontsize=15)
plt.title('Runtime of all the movies', fontsize=15)
plt.hist(tmdb_data['runtime'], rwidth = 0.9, bins =35)
plt.show()
```

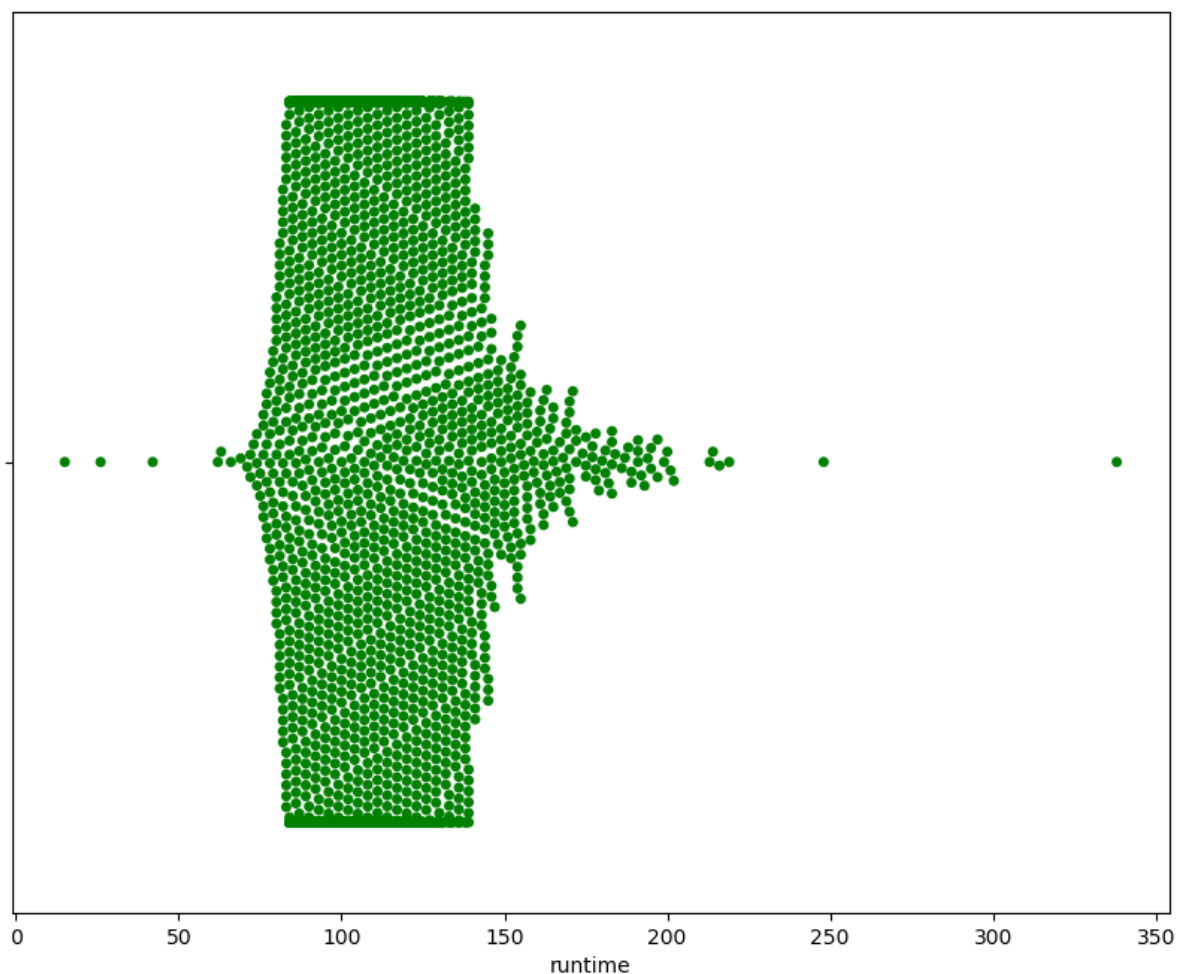


In this histogram is showing positively right skewed. Most of the movies runtime are between 90 to 140. Almost 6,000 and more no.of movies fall in this criteria.

```
In [18]: import seaborn as sns
plt.figure(figsize=(10,8), dpi = 100)
#using seaborn to generate the boxplot
sns.boxplot(tmdb_data['runtime'], linewidth = 3)
plt.show()
```



```
In [33]: plt.figure(figsize=(10,8), dpi = 100)
sns.swarmplot(tmdb_data['runtime'], color = 'green')
plt.show()
```



```
In [19]: tmdb_data['runtime'].describe()
```

```
Out[19]: count    3854.000000
mean      109.220291
std       19.922820
min       15.000000
25%      95.000000
50%     106.000000
75%     119.000000
max      338.000000
Name: runtime, dtype: float64
```

By looking the plot and calculations, I can conclude that 1. Average runtime for 25% of movies is 95 minutes 2. Average runtime for 50% of movies is 106 minutes 3. Average runtime for 75% of movies is 119 minutes

1. Movies with most and least earned revenue.

```

In [20]: #defining the function
def calculate(column):
    #for highest earned profit
    high= tmdb_data[column].idxmax()
    high_details=pd.DataFrame(tmdb_data.loc[high])

    #for lowest earned profit
    low= tmdb_data[column].idxmin()
    low_details=pd.DataFrame(tmdb_data.loc[low])

    #collectin data in one place
    info=pd.concat([high_details, low_details], axis=1)

    return info
calculate('revenue')

```

Out[20]:

	1386	5067
popularity	9.43277	0.462609
budget	2.37e+08	6e+06
revenue	2.78151e+09	2
original_title	Avatar	Shattered Glass
cast	Sam Worthington Zoe Saldana Sigourney Weaver S...	Hayden Christensen Peter Sarsgaard Chloë Sevini...
director	James Cameron	Billy Ray
tagline	Enter the World of Pandora.	NaN
runtime	162	94
genres	Action Adventure Fantasy Science Fiction	Drama History
release_date	2009-12-10 00:00:00	2003-11-14 00:00:00
vote_count	8458	46
vote_average	7.1	6.4
release_year	2009	2003
budget_adj	2.40887e+08	7.11212e+06
revenue_adj	2.82712e+09	2.37071

Column with 1386 shows the most revenue earned. That is $2.78151e + 09$. And the column with 5067 shows least earned. That is 2.

1. Movies with longest and shortest runtime values.

In [21]: `calculate('runtime')`

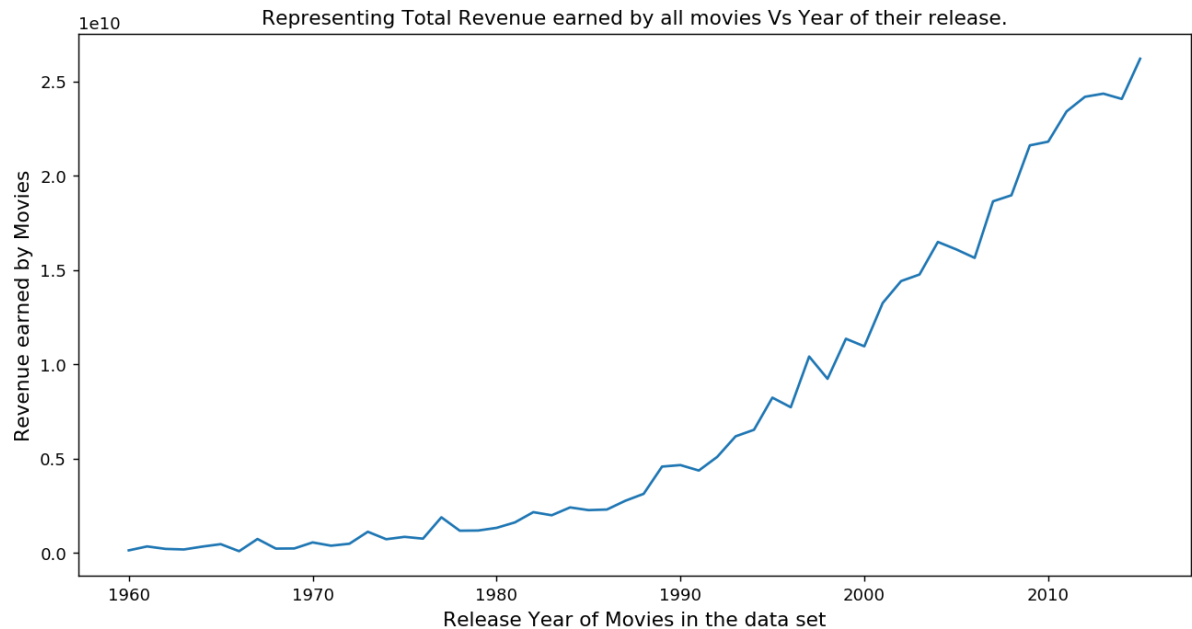
Out[21]:

	2107	5162
popularity	0.534192	0.208637
budget	1.8e+07	10
revenue	871279	5
original_title	Carlos	Kid's Story
cast	Edgar Ram��rez Alexander Scheer Fadi Abi Samra...	Clayton Watson Keanu Reeves Carrie-Anne Moss K...
director	Olivier Assayas	Shinichiro Watanabe
tagline	The man who hijacked the world	NaN
runtime	338	15
genres	Crime Drama Thriller History	Science Fiction Animation
release_date	2010-05-19 00:00:00	2003-06-02 00:00:00
vote_count	35	16
vote_average	6.2	6.8
release_year	2010	2003
budget_adj	1.8e+07	11.8535
revenue_adj	871279	5.92676

Longest runtime show in column 2107 that is 338 minutes. And shortest runtime in column 5162 that is 15 minutes.

1. Year of release vs revenue earned.

```
In [22]: revenue_year = tmdb_data.groupby('release_year')['revenue'].sum()
plt.figure(figsize=(12,6), dpi = 130)
plt.xlabel('Release Year of Movies in the data set', fontsize = 12)
plt.ylabel('Revenue earned by Movies', fontsize = 12)
plt.title('Representing Total Revenue earned by all movies Vs Year of their release.')
plt.plot(revenue_year)
plt.show()
```



```
In [23]: revenue_year.idxmax()
```

Out[23]: 2015

From 1960 to 2015 there was a significant increase in revenue year wise. And in year 2015 earn highest revenue.

What when we fix the revenue earn by movies is \$ 50M

```
In [24]: revenue_data = tmdb_data[tmdb_data['revenue'] >= 50000000]
revenue_data.index = range(len(revenue_data))
revenue_data.index = revenue_data.index + 1
revenue_data.head(3)
```

Out[24]:

	popularity	budget	revenue	original_title	cast	director	tagline	runtime
1	32.985763	150000000.0	1.513529e+09	Jurassic World	Chris Pratt Bryce Dallas Howard Irrfan Khan Vi...	Colin Trevorrow	The park is open.	1
2	28.419936	150000000.0	3.784364e+08	Mad Max: Fury Road	Tom Hardy Charlize Theron Hugh Keays-Byrne Nic...	George Miller	What a Lovely Day.	1
3	13.112507	110000000.0	2.952382e+08	Insurgent	Shailene Woodley Theo James Kate Winslet Ansel...	Robert Schwentke	One Choice Can Destroy You	1

```
In [25]: len(revenue_data) # no of rows
```

Out[25]: 1836

So dataset is reduced to 1836 from 3853.

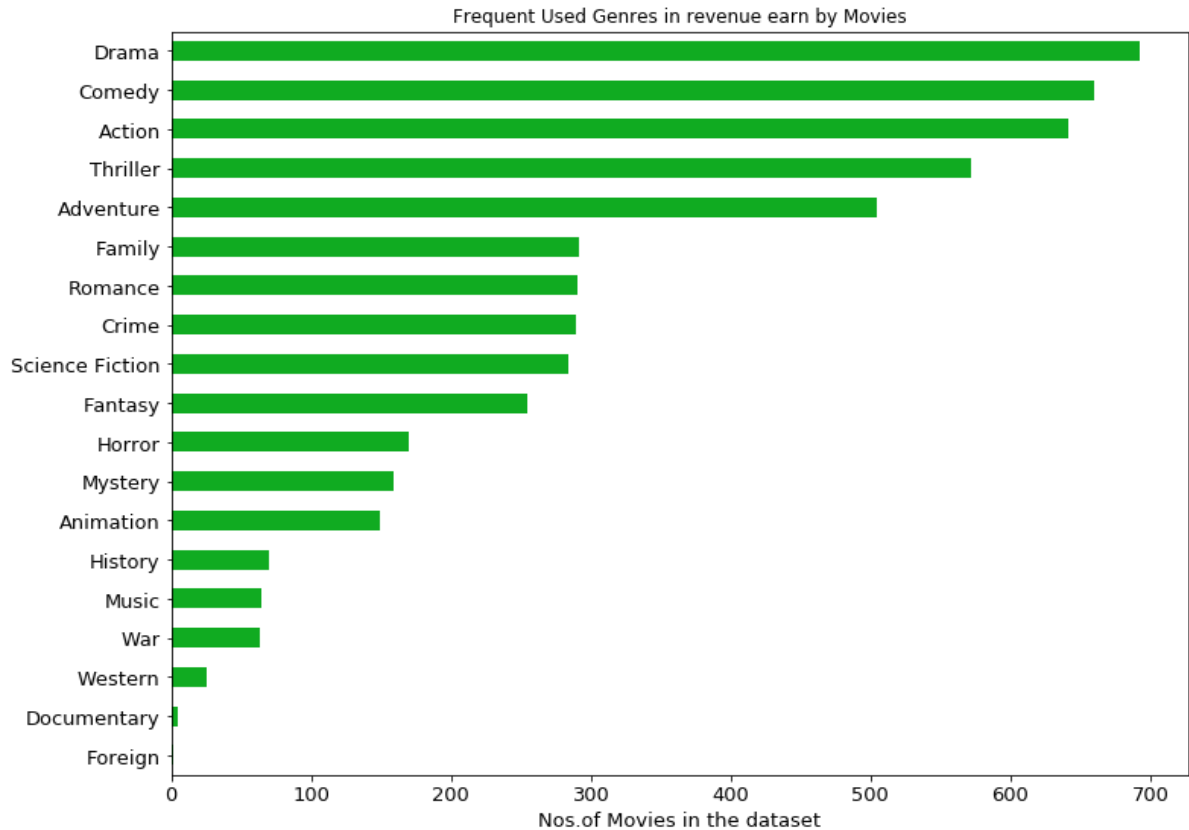
Part 2

1. Succesful Genres

```
In [26]: def data(column):
data = revenue_data[column].str.cat(sep = '|')
data = pd.Series(data.split('|'))
count = data.value_counts(ascending = False)
return count
count = data('genres')
count.head()
```

Out[26]: Drama 693
Comedy 660
Action 642
Thriller 572
Adventure 505
dtype: int64


```
In [40]: count.sort_values(ascending = True, inplace = True)
lt = count.plot.barh(color = '#10ab21', fontsize = 13)
lt.set(title = 'Frequent Used Genres in revenue earn by Movies')
lt.set_xlabel('Nos.of Movies in the dataset', color = 'black', fontsize = '13'
)
lt.figure.set_size_inches(12, 9)
plt.show()
```



1. Most Frequent Cast

```
In [27]: count = data('cast')
count.head()
```

```
Out[27]: Bruce Willis      32
Tom Cruise      30
Tom Hanks       28
Robert De Niro  28
Brad Pitt       27
dtype: int64
```

Bruce willis is on the top with 32 cast and Tom Cruise on second with 30 cast.

1. Average budget

```
In [28]: def revenue_avg(column):  
         return revenue_data[column].mean()  
         revenue_avg('budget')
```

Out[28]: 58559101.38344227

When movies average budget is 59millionthanmoviesearnrevenue50 million more.

1. Average duration

```
In [29]: revenue_avg('runtime')
```

Out[29]: 113.12581699346406

when average duration movies is 113 minutes than movies earn \$50 million more.

1. Movies popularity

```
In [30]: def revenue_avg(column):  
         return revenue_data[column].mean()  
         revenue_avg('release_year')
```

Out[30]: 2002.6252723311547

Average revenue earn by year by release is \$2002 million

Conclusions

In this data analysis i can able to find the various factors which involed to earn revenue from the movies. Some finding are below

1. Average budget must be around \$60 million.
2. Average duration should be 113 minutes.
3. Genre should be Drama, Comedy, Action, Thriller, Adventure.
4. Most Frequent Cast are Bruce Willis, Tom Cruise, Robert De Niro, Tom Hanks, Brad Pitt.

These are some factor through which movies earn more revenue and average revenue \$2002 million dollar by release years.

Limitations:

The data anaysis process was done which had significant amount of revenue earn is around \$50 million on various runtime, budget, genres. But In this dataset i observe that the profit column is missing so we can not analysis on the various fector which lead to profiable movies. And Currency unit is not there so it might be some possibility to miss match in the results.

In []: