Business Problem

Microsoft sees all the big companies creating original video content and they want to get in on the fun. They have decided to create a new movie studio, but they don't know anything about creating movies. You are charged with exploring what types of films are currently doing the best at the box office. In the following project, I will attement to translate those findings into actionable insights that the head of Microsoft's new movie studio can use to help decide what type of films to create.

In [19]: #Start by importing the necessary libraries

import pandas as pd
import numpy as np

import matplotlib.pyplot as plt

import seaborn as sns

In [20]: #Open csv file as a Pandas DataFrame to load the data

df = pd.read_csv('title_basics.csv')
df

Out[20]:

	tconst	primary_title	original_title	start_year	runtime_minutes	genres	
0	tt0063540	Sunghursh	Sunghursh	2013	175.0	Action,Crime,Drama	
1	tt0066787	One Day Before the Rainy Season	Ashad Ka Ek Din	2019	114.0	Biography,Drama	
2	tt0069049	The Other Side of the Wind	The Other Side of the Wind	2018	122.0	Drama	
3	tt0069204	Sabse Bada Sukh	Sabse Bada Sukh	2018	NaN	Comedy, Drama	
4	tt0100275	The Wandering Soap Opera	La Telenovela Errante	2017	80.0	Comedy,Drama,Fantasy	
146139	tt9916538	Kuambil Lagi Hatiku	Kuambil Lagi Hatiku	2019	123.0	Drama	
146140	tt9916622	Rodolpho Teóphilo - O Legado de um Pioneiro	Rodolpho Teóphilo - O Legado de um Pioneiro	2015	NaN	Documentary	
146141	tt9916706	Dankyavar Danka	Dankyavar Danka	2013	NaN	Comedy	
146142	tt9916730	6 Gunn	6 Gunn	2017	116.0	NaN	
146143	tt9916754	Chico Albuquerque - Revelações	Chico Albuquerque - Revelações	2013	NaN	Documentary	

146144 rows × 6 columns

memory usage: 6.7+ MB

In [21]: df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 146144 entries, 0 to 146143

Data columns (total 6 columns):

Column Non-Null Count Dtype -------------0 tconst 146144 non-null object 1 primary_title 146143 non-null object original_title 146122 non-null object 3 start_year 146144 non-null int64 4 runtime_minutes 114405 non-null float64 140736 non-null object 5 genres dtypes: float64(1), int64(1), object(4)

```
In [22]: #The columns primary_title and original_title have have almost identical rows,
         #Having noted row similarities in the two columns drop the primary_title
         # Drop a column using axis=1
         column_to_drop = 'primary_title'
         newdf = df.drop('primary_title', axis=1)
         # Display the resulting DataFrame
         print(newdf)
                    tconst
                                                          original_title start_year \
         0
                 tt0063540
                                                              Sunghursh
                                                                                2013
         1
                 tt0066787
                                                        Ashad Ka Ek Din
                                                                                2019
```

```
tt0069049
                                    The Other Side of the Wind
                                                                      2018
2
3
       tt0069204
                                               Sabse Bada Sukh
                                                                      2018
4
       tt0100275
                                         La Telenovela Errante
                                                                      2017
146139 tt9916538
                                           Kuambil Lagi Hatiku
                                                                      2019
146140 tt9916622 Rodolpho Teóphilo - O Legado de um Pioneiro
                                                                      2015
146141 tt9916706
                                                                      2013
                                               Dankyavar Danka
146142
       tt9916730
                                                        6 Gunn
                                                                      2017
146143 tt9916754
                                Chico Albuquerque - Revelações
                                                                      2013
```

```
runtime_minutes
                                         genres
0
                  175.0
                            Action, Crime, Drama
1
                  114.0
                               Biography,Drama
2
                   122.0
                                          Drama
3
                    NaN
                                  Comedy, Drama
4
                    80.0
                          Comedy, Drama, Fantasy
                    . . .
146139
                   123.0
                                          Drama
146140
                     NaN
                                   Documentary
146141
                     NaN
                                         Comedy
146142
                                            NaN
                   116.0
146143
                     NaN
                                   Documentary
```

[146144 rows x 5 columns]

```
In [23]: # Proceed to rename the column original_title to title
   newdf = newdf.rename(columns={'original_title': 'title'})
# Display the DataFrame after renaming the column
   newdf.head()
```

Out[23]:

genres	runtime_minutes	start_year	title	tconst	
Action,Crime,Drama	175.0	2013	Sunghursh	tt0063540	0
Biography,Drama	114.0	2019	Ashad Ka Ek Din	tt0066787	1
Drama	122.0	2018	The Other Side of the Wind	tt0069049	2
Comedy,Drama	NaN	2018	Sabse Bada Sukh	tt0069204	3
Comedy, Drama, Fantasy	80.0	2017	La Telenovela Errante	tt0100275	4

```
In [24]: #Open csv file as a Pandas DataFrame to load the data

df1 = pd.read_csv('title_ratings.csv')
    df1
```

Out[24]:

	tconst	averagerating	numvotes
0	tt10356526	8.3	31
1	tt10384606	8.9	559
2	tt1042974	6.4	20
3	tt1043726	4.2	50352
4	tt1060240	6.5	21
73851	tt9805820	8.1	25
73852	tt9844256	7.5	24
73853	tt9851050	4.7	14
73854	tt9886934	7.0	5
73855	tt9894098	6.3	128

73856 rows × 3 columns

Out[25]:

	title	studio	domestic_gross	foreign_gross	year
0	Toy Story 3	BV	415000000.0	652000000	2010
1	Alice in Wonderland (2010)	BV	334200000.0	691300000	2010
2	Harry Potter and the Deathly Hallows Part 1	WB	296000000.0	664300000	2010
3	Inception	WB	292600000.0	535700000	2010
4	Shrek Forever After	P/DW	238700000.0	513900000	2010
3382	The Quake	Magn.	6200.0	NaN	2018
3383	Edward II (2018 re-release)	FM	4800.0	NaN	2018
3384	El Pacto	Sony	2500.0	NaN	2018
3385	The Swan	Synergetic	2400.0	NaN	2018
3386	An Actor Prepares	Grav.	1700.0	NaN	2018

3387 rows × 5 columns

```
In [26]: # Combing title_basics and title_ratings
#To merge the dataframes, we use the following code:
    merged_df = pd.merge(newdf, df1, on='tconst', how='outer')
    merged_df.head()
```

Out[26]:

	tconst	title	start_year	runtime_minutes	genres	averagerating	numvotes
0	tt0063540	Sunghursh	2013	175.0	Action,Crime,Drama	7.0	77.0
1	tt0066787	Ashad Ka Ek Din	2019	114.0	Biography,Drama	7.2	43.0
2	tt0069049	The Other Side of the Wind	2018	122.0	Drama	6.9	4517.0
3	tt0069204	Sabse Bada Sukh	2018	NaN	Comedy,Drama	6.1	13.0
4	tt0100275	La Telenovela Errante	2017	80.0	Comedy.Drama.Fantasy	6.5	119.0

```
In [27]: merged_df.info()
          <class 'pandas.core.frame.DataFrame'>
          RangeIndex: 146144 entries, 0 to 146143
          Data columns (total 7 columns):
           # Column
                                 Non-Null Count
                                                   Dtype
                                 146144 non-null
           0
               tconst
                                                   object
           1
                                 146122 non-null
                                                   object
               title
                                 146144 non-null
           2
                                                   int64
               start_year
               runtime_minutes 114405 non-null
                                                   float64
                                 140736 non-null
           4
                                                   obiect
               genres
           5
               averagerating
                                  73856 non-null
                                                    float64
                                 73856 non-null
               numvotes
                                                    float64
          dtypes: float64(3), int64(1), object(3)
          memory usage: 7.8+ MB
In [28]: # Check for missing values
          merged_df.isna().sum()
Out[28]: tconst
                                   a
          title
                                  22
          start_year
                                  a
          runtime minutes
                              31739
          genres
                               5408
                              72288
          averagerating
          numvotes
                              72288
          dtype: int64
In [29]: # Drop null values
          merged_df.dropna(inplace=True)
          merged_df.head()
Out[29]:
                tconst
                                        title start_year runtime_minutes
                                                                                      genres averagerating
                                                                                                         numvotes
          0 tt0063540
                                   Sunghursh
                                                 2013
                                                               175.0
                                                                            Action, Crime, Drama
                                                                                                      7.0
                                                                                                              77.0
           1 tt0066787
                              Ashad Ka Ek Din
                                                 2019
                                                                114.0
                                                                               Biography, Drama
                                                                                                      7.2
                                                                                                              43.0
           2 tt0069049 The Other Side of the Wind
                                                 2018
                                                               122.0
                                                                                      Drama
                                                                                                      6.9
                                                                                                             4517.0
           4 tt0100275
                          La Telenovela Errante
                                                 2017
                                                                80.0
                                                                         Comedy, Drama, Fantasy
                                                                                                      6.5
                                                                                                              119.0
           7 tt0137204
                              Joe Finds Grace
                                                 2017
                                                                83.0 Adventure, Animation, Comedy
                                                                                                             263.0
                                                                                                      8.1
In [30]: merged_df.isna().sum()
Out[30]: tconst
          title
                              a
          start_year
                              0
          runtime_minutes
                              a
                              0
          genres
          averagerating
                              0
          numvotes
          dtype: int64
In [31]: merged_df.info()
          <class 'pandas.core.frame.DataFrame'>
          Index: 65720 entries, 0 to 146134
          Data columns (total 7 columns):
           #
               Column
                                 Non-Null Count Dtype
           0
               tconst
                                 65720 non-null
                                                  object
           1
               title
                                 65720 non-null
                                                  object
           2
               start_year
                                 65720 non-null
                                                  int64
               runtime minutes 65720 non-null float64
           4
               genres
                                 65720 non-null object
               averagerating
                                 65720 non-null float64
                                 65720 non-null float64
               numvotes
          dtypes: float64(3), int64(1), object(3)
          memory usage: 4.0+ MB
```

```
In [32]: #To merge merged_df and df2 we use the following code
          merged_df4 = pd.merge(merged_df, df2, on='title', how='outer')
          merged_df4.head()
Out[32]:
                tconst
                            title start_year runtime_minutes
                                                                           genres averagerating numvotes studio domestic_gross foreign_gross
           0 tt0063540
                      Sunahursh
                                    2013.0
                                                                 Action, Crime, Drama
                                                                                           7.0
                                                                                                           NaN
                                                    175.0
                                                                                                    77.0
                                                                                                                         NaN
                                                                                                                                       NaN
                        Ashad Ka
           1 tt0066787
                                    2019.0
                                                    114 0
                                                                    Biography, Drama
                                                                                           72
                                                                                                    43.0
                                                                                                           NaN
                                                                                                                         NaN
                                                                                                                                      NaN
                          Ek Din
                        The Other
           2 tt0069049
                       Side of the
                                    2018.0
                                                    122.0
                                                                            Drama
                                                                                           6.9
                                                                                                  4517.0
                                                                                                           NaN
                                                                                                                         NaN
                                                                                                                                      NaN
                           Wind
                             La
           3 tt0100275 Telenovela
                                    2017.0
                                                     80.0
                                                              Comedy, Drama, Fantasy
                                                                                           6.5
                                                                                                   119.0
                                                                                                           NaN
                                                                                                                          NaN
                                                                                                                                       NaN
                          Errante
                        Joe Finds
           4 tt0137204
                                    2017.0
                                                     83.0 Adventure, Animation, Comedy
                                                                                           8.1
                                                                                                   263.0
                                                                                                           NaN
                                                                                                                         NaN
                                                                                                                                       NaN
                          Grace
                                                                                                                                        \triangleright
In [33]: merged_df4.info()
          <class 'pandas.core.frame.DataFrame'>
          RangeIndex: 66975 entries, 0 to 66974
          Data columns (total 11 columns):
                                  Non-Null Count Dtype
           #
               Column
          ---
                                  _____
                                  65720 non-null object
           0
               tconst
           1
               title
                                  66975 non-null
                                                   object
           2
                                  65720 non-null float64
               start_year
           3
                runtime_minutes
                                  65720 non-null
                                                   float64
                                  65720 non-null
           4
                                                   object
               genres
           5
                averagerating
                                  65720 non-null float64
                                  65720 non-null float64
           6
               numvotes
                studio
                                  3651 non-null
                                                   object
           8
               {\tt domestic\_gross}
                                  3623 non-null
                                                   float64
                foreign_gross
                                  2209 non-null
                                                   object
                                                   float64
           10 year
                                  3656 non-null
          dtypes: float64(6), object(5)
          memory usage: 5.6+ MB
In [34]: # Check for missing values
          merged_df4.isna().sum()
Out[34]: tconst
                                1255
          title
                                   0
          start_year
                                1255
          runtime_minutes
                                1255
          genres
                                1255
          averagerating
                                1255
          numvotes
                                1255
          studio
                               63324
          domestic_gross
                               63352
          foreign_gross
                               64766
          year
                               63319
          dtype: int64
```

```
In [35]: # Drop null values
          merged_df4.dropna(inplace=True)
          merged_df4.head()
Out[35]:
                 tconst
                              title start_year runtime_minutes
                                                                             genres averagerating numvotes studio domestic_gross foreign_gross
                            On the
           31 tt0337692
                                                                                                              IFC
                                                                                                                        744000.0
                                      2012.0
                                                       124.0 Adventure, Drama, Romance
                                                                                             6.1
                                                                                                    37886.0
                                                                                                                                      8000000
                             Road
                            On the
           32 tt4339118
                                      2014.0
                                                        89.0
                                                                             Drama
                                                                                             6.0
                                                                                                       6.0
                                                                                                              IFC
                                                                                                                        744000.0
                                                                                                                                      8000000
                             Road
                            On the
              tt5647250
                                      2016.0
                                                       121.0
                                                                                             5.7
                                                                                                      127.0
                                                                                                              IFC
                                                                                                                        744000.0
                                                                                                                                      8000000
                                                                             Drama
                             Road
                         The Secret
           38 tt0359950
                             Life of
                                      2013.0
                                                       114.0
                                                              Adventure, Comedy, Drama
                                                                                             7.3
                                                                                                  275300.0
                                                                                                              Fox
                                                                                                                       58200000.0
                                                                                                                                    129900000
                        Walter Mitty
                            A Walk
           42 tt0365907
                         Among the
                                      2014.0
                                                       114.0
                                                                   Action, Crime, Drama
                                                                                             6.5
                                                                                                   105116.0
                                                                                                              Uni.
                                                                                                                       26300000.0
                                                                                                                                     26900000
                        Tombstones
In [36]: merged_df4.isna().sum()
Out[36]: tconst
                               0
          title
                               0
          start year
                               0
          runtime_minutes
                               0
          genres
                               0
          averagerating
                               0
          numvotes
          studio
                               0
          domestic_gross
                               0
          foreign_gross
                               0
          year
          dtype: int64
In [37]: merged_df4.info()
          <class 'pandas.core.frame.DataFrame'>
          Index: 1518 entries, 31 to 64832
          Data columns (total 11 columns):
               Column
                                  Non-Null Count
           #
                                                    Dtype
          ---
           0
                tconst
                                   1518 non-null
                                                    object
           1
                title
                                   1518 non-null
                                                    object
                                   1518 non-null
                                                    float64
           2
                start_year
                runtime_minutes 1518 non-null
           3
                                                    float64
                genres
                                   1518 non-null
                                                    object
                                                    float64
           5
                averagerating
                                   1518 non-null
           6
                numvotes
                                   1518 non-null
                                                    float64
           7
                                   1518 non-null
                                                    object
                studio
                domestic_gross
                                   1518 non-null
                                                     float64
                                   1518 non-null
                                                    object
           9
                foreign_gross
           10
               year
                                   1518 non-null
                                                    float64
          dtypes: float64(6), object(5)
          memory usage: 142.3+ KB
```

Data cleaning

In this section, we clean the data to generate quality data.

###We look out for unnecessary data

```
In [38]: # Drop unneeded column

merged_df5 = merged_df4.drop('tconst', axis=1)
merged_df5.head()
```

Out[38]:

	title	start_year	runtime_minutes	genres	averagerating	numvotes	studio	domestic_gross	foreign_gross	year
31	On the Road	2012.0	124.0	Adventure, Drama, Romance	6.1	37886.0	IFC	744000.0	8000000	2012.0
32	On the Road	2014.0	89.0	Drama	6.0	6.0	IFC	744000.0	8000000	2012.0
33	On the Road	2016.0	121.0	Drama	5.7	127.0	IFC	744000.0	8000000	2012.0
38	The Secret Life of Walter Mitty	2013.0	114.0	Adventure,Comedy,Drama	7.3	275300.0	Fox	58200000.0	129900000	2013.0
42	A Walk Among the Tombstones	2014.0	114.0	Action,Crime,Drama	6.5	105116.0	Uni.	26300000.0	26900000	2014.0

##We check for missing values ###Missing values would make our data inaccurate which may lead to bias in decision making.

```
In [39]: # Check for missing values

merged_df5.isna().sum()

#There are no missing values
```

```
Out[39]: title
         start_year
                             0
         runtime_minutes
                             0
         genres
         averagerating
                             0
         numvotes
         studio
         domestic_gross
                             0
         foreign_gross
                             0
         year
                             a
         dtype: int64
```

We check for duplicates

```
In [40]: #To check for duplicates we use the code
merged_df5.duplicated().sum()

#No duplicates exist, we proceed
```

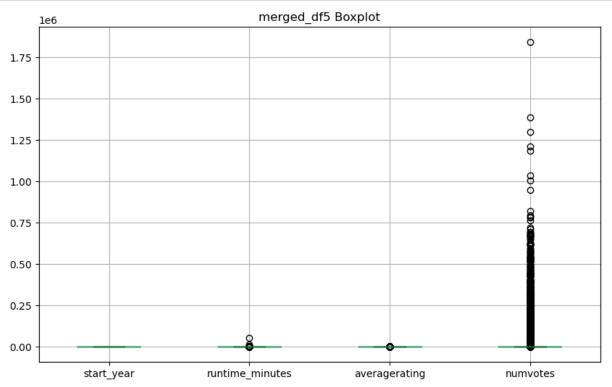
Out[40]: 0

Handling outliers

Outliers are extreme values that greatly stand out $\,$ an overall pattern of values. They may manifest as a typo during data entry.

They are mainly dependent on context, proporton domain

```
In [51]: # Plot a boxplot
fig, ax = plt.subplots(figsize=(10, 6)) # Adjust the width and height as needed
merged_df5.boxplot(ax=ax)
plt.title('merged_df5 Boxplot')
plt.show()
```



Exploratory Data Analysis

This will help us get a good perspective on the company's data

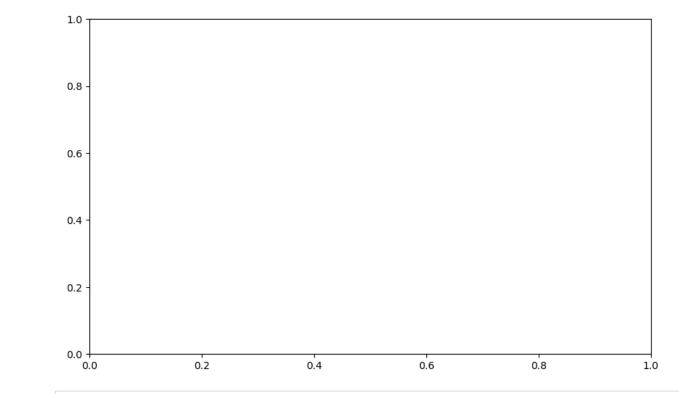
```
In [53]: # numvotes analysis
         merged_df5.numvotes.value_counts()
Out[53]: numvotes
                      2231
         6.0
         5.0
                      2076
         7.0
                      1923
         8.0
                      1702
         9.0
                      1514
         8442.0
                        1
         10512.0
                         1
         123577.0
                         1
         130084.0
                         1
         19632.0
                         1
         Name: count, Length: 7349, dtype: int64
In [49]: |# average rating analysis
         merged_df5.averagerating.value_counts()
Out[49]: averagerating
         7.0
                 0.031132
                  0.030949
         6.5
                 0.030919
         6.6
                 0.030615
         7.2
         6.8
                 0.030386
         9.6
                 0.000228
         10.0
                 0.000198
         9.7
                  0.000167
         9.8
                  0.000167
         9.9
                  0.000076
```

Name: proportion, Length: 91, dtype: float64

```
In [54]: # runtime_minutes analysis
         merged_df5.runtime_minutes.value_counts()
Out[54]: runtime_minutes
         90.0
                  4718
                  2142
         80.0
         85.0
                  2048
         100.0
                  1954
         95.0
                  1919
         202.0
         319.0
                     1
         350.0
                     1
         476.0
                     1
         261.0
         Name: count, Length: 289, dtype: int64
In [56]: # startyear analysis
         merged_df5.start_year.value_counts()
Out[56]: start_year
         2016
                 7785
         2017
                 7718
         2015
                 7650
         2014
                 7528
         2013
                 7216
         2012
                 6866
         2018
                 6573
         2011
                 6542
         2010
                 6038
         2019
                 1804
         Name: count, dtype: int64
```

```
In [58]: # Create subplots with specific dimensions
         fig, ax = plt.subplots(figsize=(10, 6))
         # Plot a bar chart using the same axes (ax)
         merged_df5.sum().plot(kind='bar', ax=ax, color=['blue', 'green'])
         # Customize the plot
         plt.title('Bar Chart for merged_df5')
         plt.xlabel('Columns')
         plt.ylabel('Sum')
         plt.show()
         ______
                                                  Traceback (most recent call last)
         Cell In[58], line 5
               2 fig, ax = plt.subplots(figsize=(10, 6))
               4 # Plot a bar chart using the same axes (ax)
         ----> 5 merged_df5.sum().plot(kind='bar', ax=ax, color=['blue', 'green'])
               7 # Customize the plot
               8 plt.title('Bar Chart for merged_df5')
         File ~\anaconda3\Lib\site-packages\pandas\plotting\_core.py:975, in PlotAccessor.__call__(self, *args, **kwargs)
                             label_name = label_kw or data.columns
             973
                             data.columns = label_name
         --> 975 return plot_backend.plot(data, kind=kind, **kwargs)
         File ~\anaconda3\Lib\site-packages\pandas\plotting\_matplotlib\__init__.py:71, in plot(data, kind, **kwargs)
              69 kwargs["ax"] = getattr(ax, "left_ax", ax)
70 plot_obj = PLOT_CLASSES[kind](data, **kwargs)
         ---> 71 plot_obj.generate()
              72 plot_obj.draw()
              73 return plot_obj.result
         File ~\anaconda3\Lib\site-packages\pandas\plotting\_matplotlib\core.py:446, in MPLPlot.generate(self)
             444 def generate(self) -> None:
             445
                     self._args_adjust()
         --> 446
                     self._compute_plot_data()
             447
                     self._setup_subplots()
                     self._make_plot()
         File ~\anaconda3\Lib\site-packages\pandas\plotting\_matplotlib\core.py:632, in MPLPlot._compute_plot_data(self)
             630 # no non-numeric frames or series allowed
             631 if is_empty:
                     raise TypeError("no numeric data to plot")
         --> 632
             634 self.data = numeric_data.apply(self._convert_to_ndarray)
```

TypeError: no numeric data to plot



In []:

In []: