**Final Submission** Student name: Rahim Njagi Student pace: 23rd to 29 th July Scheduled project review date/time: Instructor name: Antony Muiko Blog post URL: Analysis of films performances at the box office. **Business Understanding** In this project, we are dealing with datasets related to films perfomances at the box office to provide insights into the types of films that are currently successful at the box office, enabling the company's new movie studio to make informed decisions on the types of films to produce. The analysis will help in identifying various factors that influence how well a movies perfoms in the box office i.e popular genre and return on investment. Data Understanding Datasets: 1. ('tn.movie\_budgets.csv') - csv format 2. ('IMDB') - Database **Data Preperation** We first start by loading our datasets. import sqlite3 In [1]: import pandas as pd import matplotlib.pyplot as plt import seaborn as sns df\_1 = pd.read\_csv('tn.movie\_budgets.csv') path = 'im.db' conn = sqlite3.connect(path) Movie Budgets Data #Loading the budgets dataset In [2]: df\_1 = pd.read\_csv('tn.movie\_budgets.csv') df\_1 Out[2]: id release\_date movie production\_budget domestic\_gross worldwide\_ 0 1 Dec 18, 2009 Avatar \$425,000,000 \$760,507,625 \$2,776,3 Pirates of the Caribbean: 2 May 20, 2011 \$410,600,000 \$241,063,875 \$1,045,6 On Stranger Tides Dark Jun 7, 2019 \$350,000,000 \$42,762,350 3 \$149,7 Phoenix Avengers: \$1,403,0 3 May 1, 2015 Age of \$330,600,000 \$459,005,868 Ultron Star Wars Ep. VIII: Dec 15, 2017 \$317,000,000 \$620,181,382 \$1,316,7 The Last Jedi 5777 78 Dec 31, 2018 Red 11 \$7,000 \$0 79 Apr 2, 1999 Following \$48,482 5778 \$6,000 Return to the Land 5779 80 Jul 13, 2005 \$5,000 \$1,338 Wonders A Plague Sep 29, 2015 5780 81 So \$1,400 \$0 Pleasant My Date **5781** 82 Aug 5, 2005 \$1,100 \$181,041 \$1 With Drew 5782 rows × 6 columns #Inspecting number of rows and columns in this dataset In [3]: df\_1.shape The dataset contains 5782 rows and 6 columns '\nThe dataset contains 5782 rows and 6 columns\n' Out[3]: In [4]: #Sumary of the DataFrame df\_1.info() <class 'pandas.core.frame.DataFrame'> RangeIndex: 5782 entries, 0 to 5781 Data columns (total 6 columns): Column Non-Null Count Dtype 0 id 5782 non-null int64 1 release\_date 5782 non-null object 2 5782 non-null object 3 5782 non-null production\_budget object domestic\_gross 4 5782 non-null object worldwide\_gross 5782 non-null object dtypes: int64(1), object(5) memory usage: 271.2+ KB Data Cleaning #Checking for missing values In [5]: df\_1.isna().sum() id 0 Out[5]: release\_date 0 movie 0 production\_budget 0 domestic\_gross 0 worldwide\_gross dtype: int64 In [6]: **#Dropping duplicates** df\_1.drop\_duplicates(inplace = True) #Removing non numeric signs df\_1['production\_budget'] = df\_1['production\_budget'].replace('[ \_1['domestic\_gross'] = df\_1['domestic\_gross'].replace('[\\$,]' = df\_1['worldwide\_gross'].replace('[\\$,] #Changing the numeric values to float datatype. In [8]: df\_1['production\_budget'] = df\_1['production\_budget'].astype(flo df\_1['domestic\_gross'] = df\_1['domestic\_gross'].astype(float) df\_1['worldwide\_gross'] = df\_1['worldwide\_gross'].astype(float) #Removing records with zero in 'worldwide\_gross' and 'domestic\_g In [9]: df\_1 = df\_1[(df\_1['worldwide\_gross'] != 0) & (df\_1['domestic\_gro # Rename the movie column In [10]: df\_1.rename(columns={'movie': 'movie\_id'}, inplace=True) /var/folders/pr/j40mx\_\_d147dr4btk2kxr3j80000gp/T/ipykernel\_4355/ 3575521698.py:2: SettingWithCopyWarning: A value is trying to be set on a copy of a slice from a DataFram See the caveats in the documentation: https://pandas.pydata.org/ pandas-docs/stable/user\_guide/indexing.html#returning-a-view-ver sus-a-copy df\_1.rename(columns={'movie': 'movie\_id'}, inplace=True) #Creating a Return On Investment column 'ROI' In [11]: df\_1['ROI'] = (df\_1['worldwide\_gross'] + df\_1['domestic\_gross']) /var/folders/pr/j40mx\_\_d147dr4btk2kxr3j80000gp/T/ipykernel\_4355/ 4072727822.py:2: SettingWithCopyWarning: A value is trying to be set on a copy of a slice from a DataFram Try using .loc[row\_indexer,col\_indexer] = value instead See the caveats in the documentation: https://pandas.pydata.org/ pandas-docs/stable/user\_guide/indexing.html#returning-a-view-ver sus-a-copy df\_1['ROI'] = (df\_1['worldwide\_gross'] + df\_1['domestic\_gros s']) - (df\_1['production\_budget']) In [12]: #Changing the 'release\_column' column to DateTime formart. df\_1['release\_date'] = pd.to\_datetime(df\_1['release\_date']) #Extract month from 'release\_date' df\_1['release\_month'] = df\_1['release\_date'].dt.month /var/folders/pr/j40mx\_\_d147dr4btk2kxr3j80000gp/T/ipykernel\_4355/ 2977763333.py:2: SettingWithCopyWarning: A value is trying to be set on a copy of a slice from a DataFram Try using .loc[row\_indexer,col\_indexer] = value instead See the caveats in the documentation: https://pandas.pydata.org/ pandas-docs/stable/user\_guide/indexing.html#returning-a-view-ver sus-a-copy df\_1['release\_date'] = pd.to\_datetime(df\_1['release\_date']) /var/folders/pr/j40mx\_\_d147dr4btk2kxr3j80000gp/T/ipykernel\_4355/ 2977763333.py:4: SettingWithCopyWarning: A value is trying to be set on a copy of a slice from a DataFram Try using .loc[row\_indexer,col\_indexer] = value instead See the caveats in the documentation: https://pandas.pydata.org/ pandas-docs/stable/user\_guide/indexing.html#returning-a-view-ver sus-a-copy df\_1['release\_month'] = df\_1['release\_date'].dt.month Data Analysis 1. Analysis of the months Return on Investment. month\_roi = df\_1.groupby('release\_month')['ROI'].mean().reset\_in In [13]: month\_roi = month\_roi.sort\_values(by='release\_month') #Plotting the graph In [14]: plt.figure(figsize=(14, 8)) sns.pointplot(x='release\_month', y='ROI', data=month\_roi) plt.title( 'Average ROI by Release Month' plt.xlabel('Release Month') plt.ylabel('Average ROI') plt.xticks(range(12), ['Jan', 'Feb', 'Mar', 'Apr', 'May', 'Jun', plt.show() Average ROI by Release Month 2.0 1.8 1.6 Average 1.2 0.6 Feb **IMDB** Data #Writing a Query to select specific columns from tables in imdb. In [15]: query= """ SELECT \* FROM movie\_basics JOIN movie\_ratings USING(movie\_id) JOIN directors USING (movie\_id) JOIN persons USING (person\_id); imdb = pd.read\_sql(query, conn) In [16]: imdb movie id primary title original title Out[16]: start\_year runtime\_minutes tt0063540 Sunghursh Action, C Sunghursh 2013 175.0 tt0063540 Sunghursh Sunghursh 2013 175.0 Action,C #10063540 Sunghursh 2013 Action, C Sunghursh 175.0 Sunghursh Action, C tt0063540 Sunghursh 2013 175.0 One Day Ashad Ka Ek Before the tt0066787 2019 114.0 Biogr Rainv Season 181382 tt9914642 Albatross **Albatross** 2017 NaN  $\Box$ Albatross **Albatross** 2017 181383 tt9914642 NaN La vida La vida 181384 tt9914942 2019 NaN sense la sense la Sara Amat Sara Amat La vida La vida 181385 tt9914942 sense la sense la 2019 NaN Sara Amat Sara Amat 181386 Drømmeland tt9916160 Drømmeland 2019 72.0 D 181387 rows × 13 columns #Summary of the DataFrame In [17]: imdb.info() <class 'pandas.core.frame.DataFrame'> RangeIndex: 181387 entries, 0 to 181386 Data columns (total 13 columns): Non-Null Count Column Dtype - - -181387 non-null object 0 movie\_id primary\_title 181387 non-null object 1 181387 non-null object 2 original\_title 3 start\_year 181387 non-null int64 163584 non-null float64 runtime\_minutes 4 180047 non-null object 5 genres averagerating 181387 non-null float64 6 7 181387 non-null int64 numvotes 8 181387 non-null object person\_id 181387 non-null object 9 primary\_name birth\_year 54805 non-null 10 float64 1342 non-null 11 death\_year float64 primary\_profession 181262 non-null object dtypes: float64(4), int64(2), object(7)memory usage: 18.0+ MB Data Cleaning In [18]: #Checking for missing values imdb.isna().sum() Out[18]: movie\_id 0 primary\_title original\_title 0 0 start\_year 17803 runtime\_minutes genres averagerating 0 numvotes 0 person\_id primary\_name birth\_year 126582 180045 death\_year primary\_profession 125 dtype: int64 In [19]: #Dropping columns unnecessary columns columns\_to\_drop = ['birth\_year', 'death\_year'] imdb\_cleaned = imdb.dropna(subset=columns\_to\_drop) #Filling missing values with a placeholder ('NaN') for 'genres' In [20]: imdb['genres'] = imdb['genres'].fillna('NaN') imdb['primary\_profession'] = imdb['primary\_profession'].fillna(' #Filling missing values with the median for 'runtime\_minutes' co. imdb['runtime\_minutes'] = imdb['runtime\_minutes'].fillna(imdb['r In [21]: #Creating a new Dataframe with selected columns movie\_df = imdb[['movie\_id','runtime\_minutes', 'genres','primary movie\_df movie\_id runtime\_minutes Out[21]: genres primary\_name pri Harnam Singh 0 tt0063540 175.0 Action, Crime, Drama direc Rawail Harnam Singh 1 tt0063540 175.0 Action, Crime, Drama direc Rawail Harnam Singh **2** tt0063540 175.0 Action, Crime, Drama direc Rawail Harnam Singh 3 tt0063540 175.0 Action, Crime, Drama direc Rawail 4 tt0066787 114.0 Biography, Drama Mani Kaul 81382 #9914642 Chris Jordan 94.0 Documentary Chris Jordan **181383** tt9914642 NaN **181384** tt9914942 94.0 Laura Jou miscellaneo **181385** tt9914942 94.0 NaN miscellaneo Laura Jou Joost van der **181386** tt9916160 72.0 Documentary director,cine Wiel 181387 rows × 7 columns #Summary of the DataFrame. In [22]: movie\_df.info() <class 'pandas.core.frame.DataFrame'> RangeIndex: 181387 entries, 0 to 181386 Data columns (total 7 columns): # Column Non-Null Count Dtype - - -181387 non-null object 0 movie\_id 181387 non-null 1 runtime\_minutes float64 181387 non-null 2 genres object 181387 non-null object 3 primary\_name primary\_profession 181387 non-null object averagerating 181387 non-null float64 181387 non-null int64 numvotes dtypes: float64(2), int64(1), object(4) memory usage: 9.7+ MB #Converting 'genres' to string In [23]: movie\_df['genres'] = movie\_df['genres'].astype(str) /var/folders/pr/j40mx\_\_d147dr4btk2kxr3j80000gp/T/ipykernel\_4355/ 741415197.py:2: SettingWithCopyWarning: A value is trying to be set on a copy of a slice from a DataFram Try using .loc[row\_indexer,col\_indexer] = value instead See the caveats in the documentation: https://pandas.pydata.org/ pandas-docs/stable/user\_guide/indexing.html#returning-a-view-ver sus-a-copy movie\_df['genres'] = movie\_df['genres'].astype(str) #Inspecting the number of each type of genre. In [24]: movie\_df['genres'].value\_counts() Out[24]: genres Drama 25002 Documentary 18077 Horror 13006 Comedy 12723 Comedy, Drama 5903 Action, Sport, Thriller Action, Animation, History 1 Comedy, Documentary, Fantasy Animation, Family, History 1 Documentary, Family, Sci-Fi Name: count, Length: 922, dtype: int64 In [25]: #Splitting records having commas movie\_df['genres'] = movie\_df['genres'].str.split(',') #Seperating into rows movie\_df = movie\_df.explode('genres') /var/folders/pr/j40mx\_\_d147dr4btk2kxr3j80000gp/T/ipykernel\_4355/ 4253038581.py:2: SettingWithCopyWarning: A value is trying to be set on a copy of a slice from a DataFram Try using .loc[row\_indexer,col\_indexer] = value instead See the caveats in the documentation: https://pandas.pydata.org/ pandas-docs/stable/user\_guide/indexing.html#returning-a-view-ver movie\_df['genres'] = movie\_df['genres'].str.split(',') **Data Analysis** 1. Analysis of popularity of each genre based on number of votes genre\_avgvotes = movie\_df.groupby('genres')['numvotes'].mean().r In [26]: genre\_avgvotes = genre\_avgvotes.sort\_values(by='numvotes', ascen genre\_avgvotes genres numvotes Out[26]: Adventure 39509.669574 0 Action 20300.501207 21 Sci-Fi 17444.270719 Fantasy 16580.818009 10 Animation 14812.774214 3 10739.542910 26 Western 6 Crime 7300.237541 24 Thriller 7176.028239 7134.004799 16 Mystery 4 Biography 6915.969966 Comedy 5867.176094 5 4373.603797 23 Sport Romance 4131.521739 20 9 Family 3858.710082 3740.091275 8 Drama plt.figure(figsize=(12, 8)) In [27]: sns.barplot(x='numvotes', y='genres', data=genre\_avgvotes) plt.title('Average Number of Votes by Genre') plt.xlabel('Average Number of Votes') plt.ylabel('Genres') plt.show() Average Number of Votes by Genre Adventure Action Thrille Biography 5000 15000 30000 35000 40000 20000 25000 2. Analysis of runtime in minutes of each genre genre\_runtime = movie\_df.groupby('genres')['runtime\_minutes'].me In [28]: genre\_runtime = genre\_runtime.sort\_values(by='runtime\_minutes', genre\_runtime Out[28]: genres runtime\_minutes Game-Show 11 123.500000 21 Sci-Fi 112.442857 0 Action 107.923865 107.500000 Adult 1 Crime 6 104.744897 Musical 104.291930 15 20 Romance 102.698948 100.874483 13 Horror 5 Comedy 100.543271 98 320361 8 Drama #Plotting the graph In [29]: plt.figure(figsize=(16,8)) sns.barplot(x='runtime\_minutes', y='genres', data=genre\_runtime) plt.title('Top 20 Genres by Average Runtime') plt.xlabel('Average Runtime (Minutes)') plt.ylabel('Genre') plt.show() Game-Show Interepretation and Recommendation 1. Months between April and August recorded the highest ROI.It is recommended that the studio should release films beteween this months to achieve high Return On Investment. 1. According to the distribution, the genres which had the most number of votes were: Adventure, Action, Sci Fi and Fantasy. The company should invest in producing movies with popular genres for good perfomance at the box office. 3. The company should consider producing movies with short runtime as they are cheaper for production compared to longer running time which are expensive and take more time to edit.