etflix Data Analysis

Understanding Viewer Preferences and Performance

```
In [1]: #importing libraries
import numpy as np
import pandas as pd
import seaborn as sns
import matplotlib.pyplot as plt
```

In [2]: df = pd.read_csv("mymoviedb.csv",lineterminator='\n')
 df.head(3)

Out[2]:		Release_Date	Title	Overview	Popularity	Vote_Count	Vote_Average	Oı
	0	2021-12-15	Spider- Man: No Way Home	Peter Parker is unmasked and no longer able to	5083.954	8940	8.3	
	1	2022-03-01	The Batman	In his second year of fighting crime, Batman u	3827.658	1151	8.1	
	2	2022-02-25	No Exit	Stranded at a rest stop in the mountains durin	2618.087	122	6.3	

In [3]: #viewing dataset info df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 9827 entries, 0 to 9826
Data columns (total 9 columns):

#	Column	Non-Null Count	Dtype
0	Release_Date	9827 non-null	object
1	Title	9827 non-null	object
2	Overview	9827 non-null	object
3	Popularity	9827 non-null	float64
4	Vote_Count	9827 non-null	int64
5	Vote_Average	9827 non-null	float64
6	Original_Language	9827 non-null	object
7	Genre	9827 non-null	object
8	Poster_Url	9827 non-null	object

dtypes: float64(2), int64(1), object(6)

memory usage: 691.1+ KB

• looks like our dataset has no NaNs! • Overview, Original_Language and Poster-Url wouldn't be so useful during analysis • Release_Date column needs to be casted into date time and to extract only the year value

```
In [4]: # check for Missing Data
        df.isnull().sum()
Out[4]:
        Release Date
                              0
                              0
         Title
         Overview
                              0
         Popularity
                              0
         Vote Count
                              0
         Vote_Average
                              0
         Original Language
                              0
         Genre
                              0
         Poster Url
                              0
         dtype: int64
In [5]: # exploring genres column
        df['Genre'].head(5)
Out[5]: 0
              Action, Adventure, Science Fiction
         1
                        Crime, Mystery, Thriller
         2
                                         Thriller
         3
              Animation, Comedy, Family, Fantasy
                Action, Adventure, Thriller, War
        Name: Genre, dtype: object
In [6]: # check for duplicated rows
        df.duplicated().sum()
Out[6]: np.int64(0)
In [7]: # exploring summary statistics
        df.describe()
Out[7]:
                 Popularity
                              Vote_Count Vote_Average
        count 9827.000000
                              9827.000000
                                             9827.000000
                  40.326088
                              1392.805536
                                                6.439534
         mean
           std
                 108.873998
                              2611.206907
                                                1.129759
          min
                  13.354000
                                 0.000000
                                                0.000000
          25%
                  16.128500
                               146.000000
                                                5.900000
          50%
                  21.199000
                               444.000000
                                                6.500000
```

7.100000

10.000000

1376.000000

75%

35.191500

max 5083.954000 31077.000000

[•] Exploration Summary • we have a dataframe consisting of 9827 rows and 9 columns. • our dataset looks a bit tidy with no NaNs nor duplicated values. • Release_Date column needs to be casted into date time and to extract only the • Overview, Original_Languege and Poster-Url wouldn't be so useful during analys • there is noticable outliers in Popularity column • Vote_Average better be categorised for proper analysis. • The Genre column contains comma-separated values and unnecessary white spaces, which need to be cleaned.

Data Cleaning

Casting Release_Date column and extracing year values

```
In [8]: # casting column a
          df['Release Date'] = pd.to datetime(df['Release Date'])
          # confirming changes
          print(df['Release Date'].dtypes)
        datetime64[ns]
 In [9]: df['Release Date'] = df['Release Date'].dt.year
          df['Release Date'].dtypes
 Out[9]: dtype('int32')
In [10]: df.head(4)
                                                  Popularity Vote_Count Vote_Average
Out[10]:
             Release_Date
                               Title
                                      Peter Parker
                             Spider-
                                     is unmasked
                               Man:
          0
                      2021
                                                    5083.954
                                                                     8940
                                                                                      8.3
                                          and no
                            No Way
                                       longer able
                              Home
                                             to...
                                     In his second
                                          year of
                                The
          1
                     2022
                                                    3827.658
                                                                     1151
                                                                                      8.1
                                          fighting
                            Batman
                                           crime.
                                      Batman u...
                                      Stranded at
                                     a rest stop in
          2
                      2022
                             No Exit
                                                    2618.087
                                                                      122
                                                                                      6.3
                                             the
                                       mountains
                                          durin...
                                       The tale of
          3
                                                                                      7.7
                      2021 Encanto extraordinary
                                                    2402.201
                                                                     5076
                                       family, the
                                          Madri...
          DROPPING THE COLUMNS
In [11]:
         df.drop(['Overview', 'Original_Language', 'Poster_Url'], axis=1, inplace=Tru
In [12]:
         df.head()
```

Out[12]:		Release_Date	Title	Popularity	Vote_Count	Vote_Average	Genre
	0	2021	Spider- Man: No Way Home	5083.954	8940	8.3	Action, Adventure, Science Fiction
	1	2022	The Batman	3827.658	1151	8.1	Crime, Mystery, Thriller
	2	2022	No Exit	2618.087	122	6.3	Thriller
	3	2021	Encanto	2402.201	5076	7.7	Animation, Comedy, Family, Fantasy
	4	2021	The King's Man	1895.511	1793	7.0	Action, Adventure, Thriller, War

categorizing Vote_Average column We would cut the Vote_Average values and make 4 categories: popular average below_avg not_popular to describe it more using catigorize_col() function provided above.

```
In [13]: def categorize_col(df, col, labels):
             Categorizes a numerical column based on its quartiles.
             Args:
                 df (DataFrame): The DataFrame to process.
                 col (str): The column name to categorize.
                 labels (list): List of labels from min to max.
             Returns:
                 DataFrame: The updated DataFrame with the categorized column.
             # Set the edges using the column's descriptive stats
             edges = [
                 df[col].describe()['min'],
                 df[col].describe()['25%'],
                 df[col].describe()['50%'],
                 df[col].describe()['75%'],
                 df[col].describe()['max']
             ]
             df[col] = pd.cut(df[col], edges, labels=labels, duplicates='drop')
             return df
```

```
In [14]: # define labels for edges
labels = ['not_popular','below_avg','average','popular']
```

categorize column based on labels and edges
categorize col(df,'Vote Average',labels)

Out[14]:		Release_Date	Title	Popularity	Vote_Count	Vote_Average	Genr
	0	2021	Spider- Man: No Way Home	5083.954	8940	popular	Actio Adventur Scienc Fictic
	1	2022	The Batman	3827.658	1151	popular	Crim Myster Thrille
	2	2022	No Exit	2618.087	122	below_avg	Thrill
	3	2021	Encanto	2402.201	5076	popular	Animatio Comed Famil Fantas
	4	2021	The King's Man	1895.511	1793	average	Actio Adventur Thrille Wi
	9822	1973	Badlands	13.357	896	popular	Dram Crim
	9823	2020	Violent Delights	13.356	8	not_popular	Horre
	9824	2016	The Offering	13.355	94	not_popular	Myster Thrille Horr
	9825	2021	The United States vs. Billie Holiday	13.354	152	average	Musi Dram Histo
	9826	1984	Threads	13.354	186	popular	Wa Dram Scienc Fictic

9827 rows \times 6 columns

```
In [15]: #confirming changes
df['Vote_Average'].unique()
```

In [16]: df.head(5)

Out[16]:	Release	e_Date	Title	Popularity	Vote_Count	Vote_Average	Genre
	0	2021	Spider- Man: No Way Home	5083.954	8940	popular	Action, Adventure, Science Fiction
	1	2022	The Batman	3827.658	1151	popular	Crime, Mystery, Thriller
	2	2022	No Exit	2618.087	122	below_avg	Thriller
	3	2021	Encanto	2402.201	5076	popular	Animation, Comedy, Family, Fantasy
	4	2021	The King's Man	1895.511	1793	average	Action, Adventure, Thriller, War
In [17]:	<pre># explori df['Vote_A</pre>	_		_counts()			
Out[17]:	Vote_Avera not_popular popular average below_avg Name: cou	ar 2 2 2 2	467 450 412 398 pe: int64	1			
In [18]:	# dropping df.dropna(e=True)				
	<pre>#confirmin df.isna().</pre>	_					
Out[18]:	Release_Da Title Popularity Vote_Count Vote_Avera Genre dtype: int	y t age	0 0 0 0 0 0				
In [19]:	<pre>df.head()</pre>						

Out[19]:		Release_Date	Title	Popularity	Vote_Count	Vote_Average	Genre
	0	2021	Spider- Man: No Way Home	5083.954	8940	popular	Action, Adventure, Science Fiction
	1	2022	The Batman	3827.658	1151	popular	Crime, Mystery, Thriller
	2	2022	No Exit	2618.087	122	below_avg	Thriller
	3	2021	Encanto	2402.201	5076	popular	Animation, Comedy, Family, Fantasy
	4	2021	The King's Man	1895.511	1793	average	Action, Adventure, Thriller, War

Split Genres and Normalize Movie Rows

```
In [20]: # split the strings into lists
    df['Genre'] = df['Genre'].str.split(', ')
    # explode the lists
    df = df.explode('Genre').reset_index(drop=True)
    df.head(5)
```

Out[20]:	F	Release_Date	Title	Popularity	Vote_Count	Vote_Average	Genre
	0	2021	Spider- Man: No Way Home	5083.954	8940	popular	Action
	1	2021	Spider- Man: No Way Home	5083.954	8940	popular	Adventure
	2	2021	Spider- Man: No Way Home	5083.954	8940	popular	Science Fiction
	3	2022	The Batman	3827.658	1151	popular	Crime
	4	2022	The Batman	3827.658	1151	popular	Mystery

```
In [21]: #Casting column into category
df['Genre'] = df['Genre'].astype('category')
```

```
# confirming changes
         df['Genre'].dtypes
Out[21]: CategoricalDtype(categories=['Action', 'Adventure', 'Animation', 'Comedy',
         'Crime',
                           'Documentary', 'Drama', 'Family', 'Fantasy', 'History',
                           'Horror', 'Music', 'Mystery', 'Romance', 'Science Fictio
         n',
                           'TV Movie', 'Thriller', 'War', 'Western'],
         , ordered=False, categories dtype=object)
In [22]: df.info()
        <class 'pandas.core.frame.DataFrame'>
       RangeIndex: 25552 entries, 0 to 25551
       Data columns (total 6 columns):
                       Non-Null Count Dtype
        # Column
        --- ----
        0
            Release_Date 25552 non-null int32
        1 Title 25552 non-null object
        2 Popularity 25552 non-null float64
        3 Vote_Count 25552 non-null int64
            Vote Average 25552 non-null category
        5
                         25552 non-null category
            Genre
        dtypes: category(2), float64(1), int32(1), int64(1), object(1)
       memory usage: 749.6+ KB
In [23]: | df.nunique()
                         100
Out[23]: Release Date
                         9415
         Title
         Popularity
                         8808
         Vote Count
                         3265
         Vote Average
                           4
         Genre
                          19
         dtype: int64
```

Now that our dataset is clean and tidy, we are left with a total of 6 columns and 25552 rows to dig into during our analysis

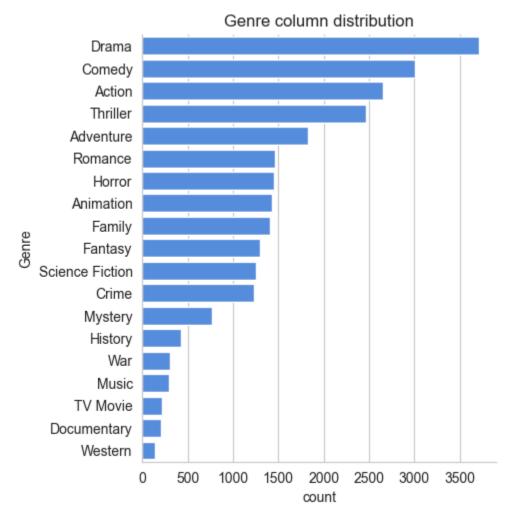
Data Visualization

here, we'd use Matplotlib and seaborn for making some informative visuals to gain insights abut our data.

```
In [24]: # setting up seaborn configurations
sns.set_style('whitegrid')
```

What is the most frequent genre of movies released on Netflix?

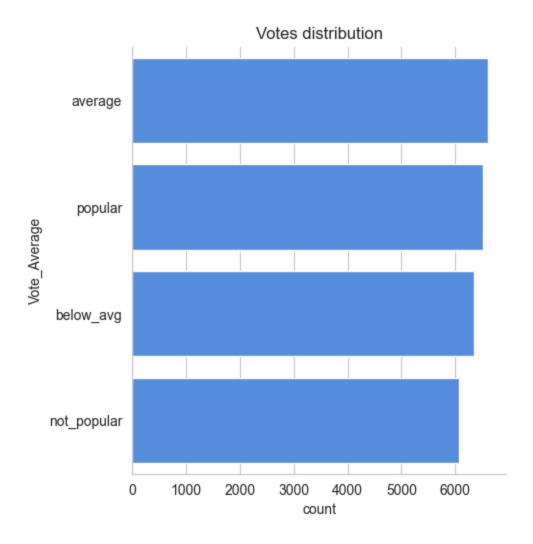
```
In [25]: # showing stats. on genre column
         df['Genre'].describe()
Out[25]:
          count
                    25552
                       19
          unique
          top
                    Drama
                     3715
          freq
          Name: Genre, dtype: object
In [26]: # visualizing genre column
         sns.catplot(y = 'Genre', data = df, kind = 'count',
                     order = df['Genre'].value counts().index,
                     color = '#4287f5')
         plt.title('Genre column distribution')
         plt.show()
```



we can notice from the above visual that Drama genre is the most frequent genre in our dataset and has appeared more than 14% of the times among 19 other genres.

Which has highest votes in vote avg column?

In [27]:	df.head()						
Out[27]:	Release	_Date	Title	Popularity	Vote_Count	Vote_Average	Genre
	0	2021	Spider- Man: No Way Home	5083.954	8940	popular	Action
	1	2021	Spider- Man: No Way Home	5083.954	8940	popular	Adventure
	2	2021	Spider- Man: No Way Home	5083.954	8940	popular	Science Fiction
	3	2022	The Batman	3827.658	1151	popular	Crime
	4	2022	The Batman	3827.658	1151	popular	Mystery
In [28]:	<pre># visualiz sns.catplo plt.title(plt.show()</pre>	t(y = ' order color	Vote_Ave = df['Vo = '#4287	rage',data : te_Average' f5')	= df,kind =].value_count		



What movie got the highest popularity? what's its genre?

In [29]: df.head(5)

Out[29]:	Release	e_Date	Title	Popularity	Vote_Count	Vote_Average	Genre
	0	2021	Spider- Man: No Way Home	5083.954	8940	popular	Action
	1	2021	Spider- Man: No Way Home	5083.954	8940	popular	Adventure
	2	2021	Spider- Man: No Way Home	5083.954	8940	popular	Science Fiction
	3	2022	The Batman	3827.658	1151	popular	Crime
	4	2022	The Batman	3827.658	1151	popular	Mystery
In [30]:				/ in dataset ['Popularit			
Out[30]:	Release	e_Date	Title	Popularity	Vote_Count	Vote_Average	Genre
	0	2021	Spider- Man: No Way Home	5083.954	8940	popular	Action
	1	2021	Spider- Man: No Way Home	5083.954	8940	popular	Adventure

What movie got the lowest popularity? what's its genre?

8940

Science

Fiction

popular

```
In [31]: # checking max popularity in dataset
df[df['Popularity'] == df['Popularity'].min()]
```

5083.954

Spider-Man:

No Way

Home

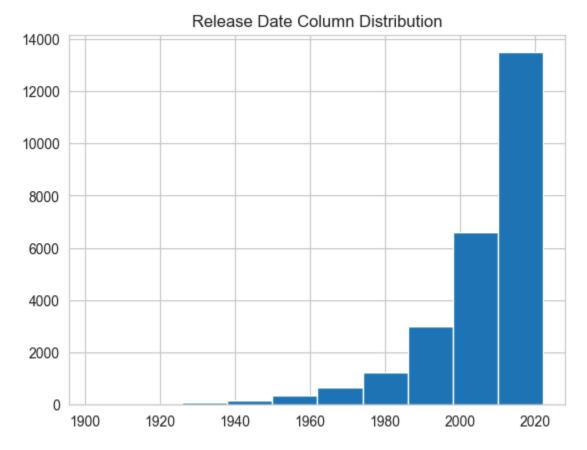
2021

2

Out[31]:		Release_Date	Title	Popularity	Vote_Count	Vote_Average	Genre
	25546	2021	The United States vs. Billie Holiday	13.354	152	average	Music
	25547	2021	The United States vs. Billie Holiday	13.354	152	average	Drama
	25548	2021	The United States vs. Billie Holiday	13.354	152	average	History
	25549	1984	Threads	13.354	186	popular	War
	25550	1984	Threads	13.354	186	popular	Drama
	25551	1984	Threads	13.354	186	popular	Science Fiction

Which year has the most filmmed movies?

```
In [32]: df['Release_Date'].hist()
  plt.title('Release Date Column Distribution')
  plt.show()
```



In []:

This notebook was converted with ${\it convert.ploomber.io}$