

```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns

!wget https://d2beiqkhq929f0.cloudfront.net/public_assets/assets/000/000/940/original/netflix.csv -O netflix.csv

--2023-11-15 04:27:11-- https://d2beiqkhq929f0.cloudfront.net/public_assets/assets/000/000/940/original/netflix.csv
Resolving d2beiqkhq929f0.cloudfront.net (d2beiqkhq929f0.cloudfront.net)... 18.172.139.61, 18.172.139.46, 18.172.139.210, ...
Connecting to d2beiqkhq929f0.cloudfront.net (d2beiqkhq929f0.cloudfront.net)|18.172.139.61|:443... connected.
HTTP request sent, awaiting response... 200 OK
Length: 3399671 (3.2M) [text/plain]
Saving to: 'netflix.csv'

netflix.csv      100%[=====>]   3.24M  2.37MB/s   in 1.4s

2023-11-15 04:27:13 (2.37 MB/s) - 'netflix.csv' saved [3399671/3399671]
```

```
netflix= pd.read_csv("netflix.csv")
```

```
netflix.shape

(8807, 12)
```

```
netflix.head()
```

	show_id	type	title	director	cast	country	date_added	release_year	
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	September 25, 2021	2020	
1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thabane...	South Africa	September 24, 2021	2021	
					Sami Bouajila, Tra...				

▼ Inference from the above data

The dataset comprises more than 8,807 titles and 12 descriptions It resembles a typical movie and TV show dataset, notably lacking any ratings. Furthermore, some columns contain missing values (NaN).

```
netflix.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 8807 entries, 0 to 8806
Data columns (total 12 columns):
#   Column          Non-Null Count  Dtype
---  -
0   show_id         8807 non-null   object
1   type            8807 non-null   object
2   title           8807 non-null   object
3   director        6173 non-null   object
4   cast            7982 non-null   object
5   country         7976 non-null   object
6   date_added      8797 non-null   object
7   release_year    8807 non-null   int64
8   rating          8803 non-null   object
9   duration        8804 non-null   object
10  listed_in       8807 non-null   object
11  description      8807 non-null   object
dtypes: int64(1), object(11)
memory usage: 825.8+ KB
```

```
print(netflix.isnull().any())
```

show_id	False
type	False
title	False
director	True

```

cast          True
country       True
date_added    True
release_year  False
rating        True
duration      True
listed_in     False
description   False
dtype: bool

```

▼ Inference from the above data

From the info, we know that there are 8807 entries and 12 columns to work with for this EDA. There are few null values in the data set, we observe that columns like - "director", "cast", "country", "date_added", "ratings" and "duration" have null values.

```
null_values = netflix.T.apply(lambda x: x.isnull().sum(), axis = 1)
```

```
null_values
```

```

show_id      0
type         0
title        0
director    2634
cast        825
country     831
date_added   10
release_year  0
rating       4
duration     3
listed_in    0
description  0
dtype: int64

```

```
null_values.sum()
```

```
4307
```

▼ Inference from the above data

Based on the observations, it is evident that the dataset contains a total of **4,307** null values. Specifically, "director" has **2,634**, "cast" has **825**, and "country" has 831 null values. We will have to handle all null data points before we can dive into EDA and modelling.

```

netflix.director.fillna("No Director", inplace=True)
netflix.cast.fillna("No Cast", inplace=True)
netflix.country.fillna("Country Unavailable", inplace=True)
netflix.dropna(subset= ["date_added", "duration", "rating"], inplace=True)

```

```
print(netflix.isnull().any())
```

```

show_id      False
type         False
title        False
director     False
cast         False
country      False
date_added   False
release_year False
rating       False
duration     False
listed_in    False
description  False
dtype: bool

```

▼ Inference from the above data

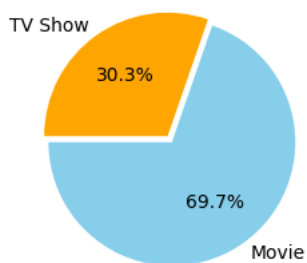
We addressed the issue of missing values by employing the imputation method. In particular, columns such as 'director,' 'cast,' and 'country' contained a significant number of missing values that couldn't be simply dropped without a loss of valuable data. To mitigate this, we utilized the .fillna function to replace the missing values with meaningful placeholders. Additionally, we performed data cleaning by removing rows with relatively fewer missing values in 'date_added,' 'duration,' and 'rating.' These steps allowed us to handle the null values effectively while preserving the integrity of the dataset."

```
netflix.head()
```

	show_id	type	title	director	cast	country	date_added	release_year
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	No Cast	United States	September 25, 2021	2020
1	s2	TV Show	Blood & Water	No Director	Ama Qamata, Khosi Ngema, Gail Mabalane, Thabane...	South Africa	September 24, 2021	2021
2	s3	TV Show	Goodbye, Juliet	Julien	Sami Bouajila, Tracy Catlett	Country	September	2021

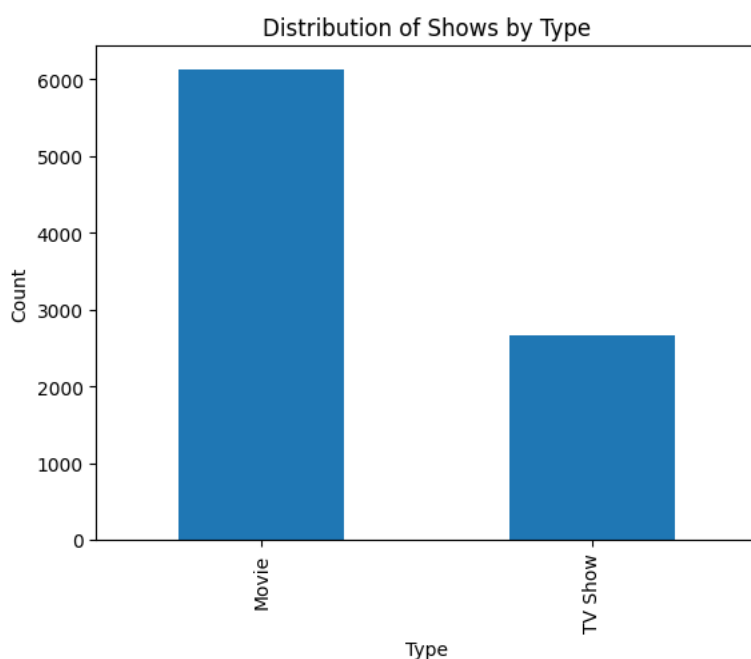
```
plt.figure(figsize=(6,3))
plt.title("Percentage of Netflix Titles that are either Movies or TV Shows")
g=plt.pie(netflix.type.value_counts(),explode=(0.03,0.03),
labels=netflix.type.value_counts().index, colors=['skyblue','orange'],autopct='%1.1f%%',
startangle=180)
plt.show()
```

Percentage of Netflix Titles that are either Movies or TV Shows



```
netflix['type'].value_counts().plot(kind='bar')
plt.title('Distribution of Shows by Type')
plt.xlabel('Type')
plt.ylabel('Count')
plt.show()
```

```
netflix['type'].value_counts()
```



```
Movie      6126
TV Show    2664
Name: type, dtype: int64
```

▼ Inference from the above data

Observing the pie chart above, it's evident that movies make up the majority, constituting approximately **69.7% (6126)** of the content, while TV shows account for the remaining **30.3%. (2664)**

```
Director = netflix.iloc[:,3]
```

```
grouped_data = netflix.groupby('director')
type_counts = grouped_data['type'].count()
```

```
top_directors= type_counts.sort_values(ascending= False).head(11)
```

```
top_directors
```

director	
No Director	2621
Rajiv Chilaka	19
Raúl Campos, Jan Suter	18
Marcus Raboy	16
Suhas Kadav	16
Jay Karas	14
Cathy Garcia-Molina	13
Jay Chapman	12
Youssef Chahine	12
Martin Scorsese	12
Steven Spielberg	11

Name: type, dtype: int64

```
top_directors = top_directors.drop(top_directors.index[0])
```

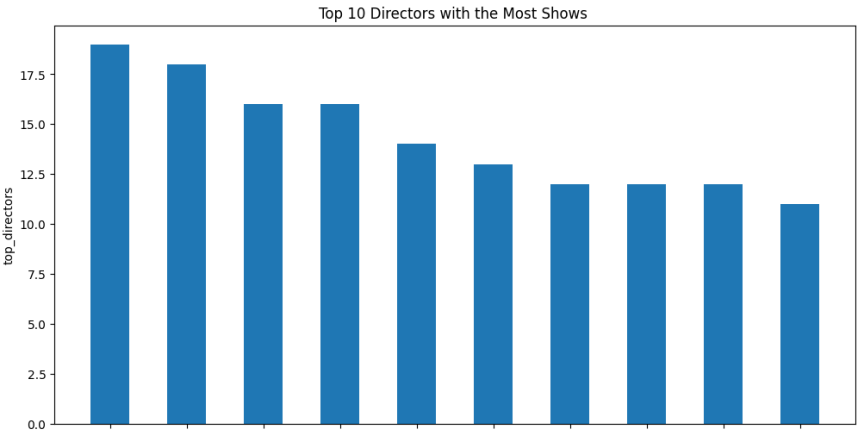
```
top_directors
```

director	
Rajiv Chilaka	19
Raúl Campos, Jan Suter	18
Marcus Raboy	16
Suhas Kadav	16
Jay Karas	14
Cathy Garcia-Molina	13
Jay Chapman	12
Youssef Chahine	12
Martin Scorsese	12
Steven Spielberg	11

Name: type, dtype: int64

```
plt.figure(figsize =(12,6))
plt.bar(x=top_directors.index , height = top_directors,width = 0.5)
plt.title ("Top 10 Directors with the Most Shows ")
plt.xticks(rotation = 90)
plt.xlabel("director")
plt.ylabel("top_directors")
```

```
plt.show()
```



▼ ANALYSIS ON MOVIES AND TV SHOWS

```
type_groupby = netflix.groupby(by = "type")

Movie_group = type_groupby.get_group("Movie")
Tv_show_group = type_groupby.get_group("TV Show")

Movie_group.head()
```

	show_id	type	title	director	cast	country	date_added	release_
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	No Cast	United States	September 25, 2021	
6	s7	Movie	My Little Pony: A New Generation	Robert Cullen, José Luis Ucha	Vanessa Hudgens, Kimiko Glenn, James Marsden, ...	Country Unavailable	September 24, 2021	
7	s8	Movie	Sankofa	Haile Gerima	Kofi Ghanaba, Oyafunmike Ogunlano, Alexandra D...	United States, Ghana, Burkina Faso, United States	September 24, 2021	

▼ Inference from the above data

We have segregated movies and TV shows for our analysis, recognizing the inherent differences between the two. This separation allows us to gain more accurate and meaningful insights from our data, as each category warrants distinct examination and evaluation.

```
Movie_group.head()
```

	show_id	type	title	director	cast	country	date_added	release_
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	No Cast	United States	September 25, 2021	
6	s7	Movie	My Little Pony: A New Generation	Robert Cullen, José Luis Ucha	Vanessa Hudgens, Kimiko Glenn, James Marsden, ...	Country Unavailable	September 24, 2021	
7	s8	Movie	Sankofa	Haile Gerima	Kofi Ghanaba, Oyafunmike Ogunlano, Alexandra D...	United States, Ghana, Burkina Faso, United States	September 24, 2021	

```
duration =Movie_group.iloc[: , [9]]
```

```
duration = Movie_group['duration'].str.split(" ").str.get(0).astype(int)

duration.mean().round(1)

99.6
```

▼ Inference from the above data

"Based on the above analysis , it is evident that the average duration of movies on the platform is approximately 99.6 minutes.

Tv_show_group.head()

	show_id	type	title	director	cast	country	date_added	release_year
1	s2	TV Show	Blood & Water	No Director	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...	South Africa	September 24, 2021	2021
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...	Country Unavailable	September 24, 2021	2021

```
duration =Tv_show_group.iloc[: , [9]]

duration =Tv_show_group['duration'].str.split(" ").str.get(0).astype(int)

duration.mean().round(1)

1.8
```

▼ Inference from the above data

"Based on the above analysis , it is evident that the average duration of TV Shows on the platform is approximately 1.8 seasons.

netflix.head()

	show_id	type	title	director	cast	country	date_added	release_year
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	No Cast	United States	September 25, 2021	2020
1	s2	TV Show	Blood & Water	No Director	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...	South Africa	September 24, 2021	2021
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...	Country Unavailable	September 24, 2021	2021

```
country_groupby = netflix.groupby(by ="country")

Show_count_by_country = country_groupby.size()

Show_count_by_country =Show_count_by_country.sort_values(ascending= False)

Show_count_by_country

country
United States    2809
India              972
```

```
Country Unavailable      829
United Kingdom          418
Japan                   243
...
Ireland, Canada, Luxembourg, United States, United Kingdom, Philippines, India    1
Ireland, Canada, United Kingdom, United States                                  1
Ireland, Canada, United States, United Kingdom                                  1
Ireland, France, Iceland, United States, Mexico, Belgium, United Kingdom, Hong Kong  1
Zimbabwe                                                         1
Length: 749, dtype: int64
```

```
Top_10_highest_Show_count_by_country = Show_count_by_country.head(11)

Top_10_highest_Show_count_by_country = Top_10_highest_Show_count_by_country.drop(Top_10_highest_Show_count_by_country.index[2])

Top_10_highest_Show_count_by_country = Top_10_highest_Show_count_by_country.reset_index()

Top_10_highest_Show_count_by_country
```

	country	0	
0	United States	2809	
1	India	972	
2	United Kingdom	418	
3	Japan	243	
4	South Korea	199	
5	Canada	181	
6	Spain	145	
7	France	124	
8	Mexico	110	
9	Egypt	106	

```
countries = Top_10_highest_Show_count_by_country['country']
movie_counts = Top_10_highest_Show_count_by_country[0]

plt.figure(figsize=(12, 6))
bars = plt.bar(countries, movie_counts)

plt.title("Top 10 Countries with the Most Shows on Netflix")
plt.xlabel("Country")
plt.ylabel("Number of Shows")
plt.xticks(rotation=45)

for bar, count in zip(bars, movie_counts):
    plt.text(bar.get_x() + bar.get_width() / 2, bar.get_height(), count, ha='center', va='bottom')

plt.show()
```



▼ Inference from the above data

From the data, it's evident that the following countries have a significant presence in Netflix's movie library. These countries stand out as the top contributors to Netflix's diverse movie collection. This format provides a clear, organized presentation of the top countries and their corresponding movie counts.

netflix.head()

	show_id	type	title	director	cast	country	date_added	release_year
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	No Cast	United States	September 25, 2021	2020
1	s2	TV Show	Blood & Water	No Director	Ama Qamata, Khosi Ngema, Gail Mabalane, Thabane...	South Africa	September 24, 2021	2021
2	s3	TV Show	Qandela	Julien	Sami Bouajila, Tracy...	Country	September	2021

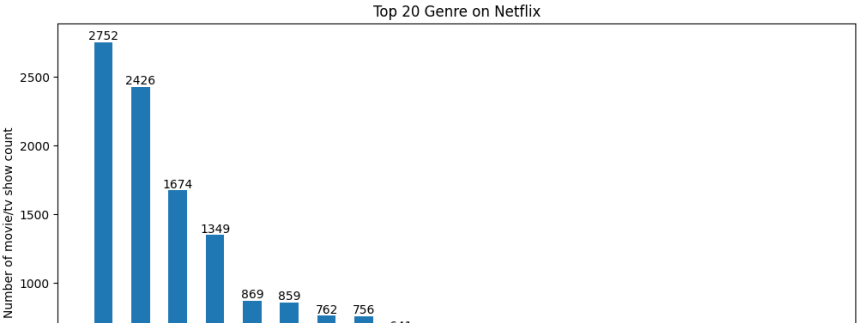
```
filtered_genres = netflix.set_index('title').listed_in.str.split(' ',
expand=True).stack().reset_index(level=1, drop=True);

genre = filtered_genres.value_counts().head(20)

plt.figure(figsize=(12, 6))
bars = plt.bar(genre.index,genre,width = .5)

plt.title("Top 20 Genre on Netflix")
plt.xlabel("Genre")
plt.ylabel("Number of movie/tv show count")
plt.xticks(rotation=90)
plt.show
for bar, count in zip(bars, genre):
    plt.text(bar.get_x() + bar.get_width() / 2, bar.get_height(), count, ha='center', va='bottom')

plt.show()
```

Key Insights :

Top 3 genres on Netflix, based on the dataset:

International Movies (2752 titles) Drama (2426 titles) Comedies (1674 titles) Recommendation: Netflix can maximize success by focusing investments on these popular genres, catering to diverse viewer preferences and enhancing the content library. Periodic analysis is advised for staying attuned to changing audience trends.

netflix.head()

	show_id	type	title	director	cast	country	date_added	release_year
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	No Cast	United States	September 25, 2021	2020
1	s2	TV Show	Blood & Water	No Director	Ama Qamata, Khosi Ngema, Gail Mabalane, Thabane...	South Africa	September 24, 2021	2021
2	s3	TV	Country	Julien	Sami Bouajila, Tracy...	Country	September	2021

```
date_added = netflix.iloc[:,6]
```

date_added

	date_added
0	September 25, 2021
1	September 24, 2021
2	September 24, 2021
3	September 24, 2021
4	September 24, 2021
...	...
8802	November 20, 2019
8803	July 1, 2019
8804	November 1, 2019
8805	January 11, 2020
8806	March 2, 2019

8790 rows × 1 columns

```
netflix['date_added'] = pd.to_datetime(netflix['date_added'].str.strip(), format='%B %d, %Y')
netflix['added_year'] = netflix['date_added'].dt.year
netflix['added_month'] = netflix['date_added'].dt.month_name()

date = netflix[['date_added', 'added_year', 'added_month']]

month_groups = netflix.groupby(by="added_month")
month_counts = month_groups.size()
```

```
month_counts = month_counts.sort_values(ascending=False)
```

```
month_counts
```

```
added_month
July      827
December  812
September 769
April     763
October   760
August    754
March     741
January   737
June      728
November  705
May       632
February  562
dtype: int64
```

```
plt.figure(figsize=(12, 6))
```

```
bars = plt.bar(month_counts.index,month_counts,width = .5)
```

```
plt.title("Month wise Movies/shows on Netflix")
```

```
plt.xlabel("Month")
```

```
plt.ylabel("Number of movie/tv show count")
```

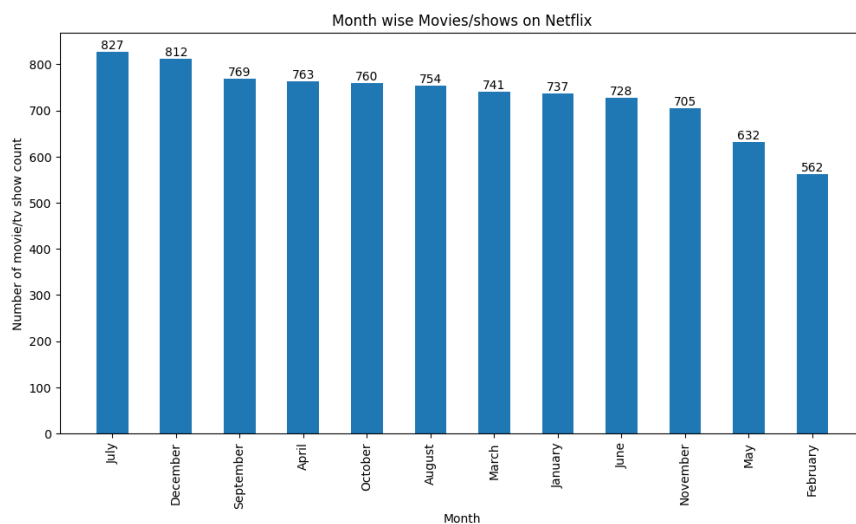
```
plt.xticks(rotation=90)
```

```
plt.show
```

```
for bar, count in zip(bars, month_counts):
```

```
    plt.text(bar.get_x() + bar.get_width() / 2, bar.get_height(), count, ha='center', va='bottom')
```

```
plt.show()
```



▼ Insights from Netflix Monthly Additions:

Seasonal Peaks: High additions in July and December suggest seasonal peaks, possibly during holidays.

Consistent Releases: Months like September, April, and October show steady content additions, indicating a consistent release schedule.

***Variable Engagement:** * Lower counts in May, November, and February may imply variable viewer engagement, influenced by factors like holidays or events.

```
Year_groups = netflix.groupby(by="added_year")
```

```
Year_counts = Year_groups.size()
```

```
Year_counts = Year_counts.sort_values(ascending=False)
```

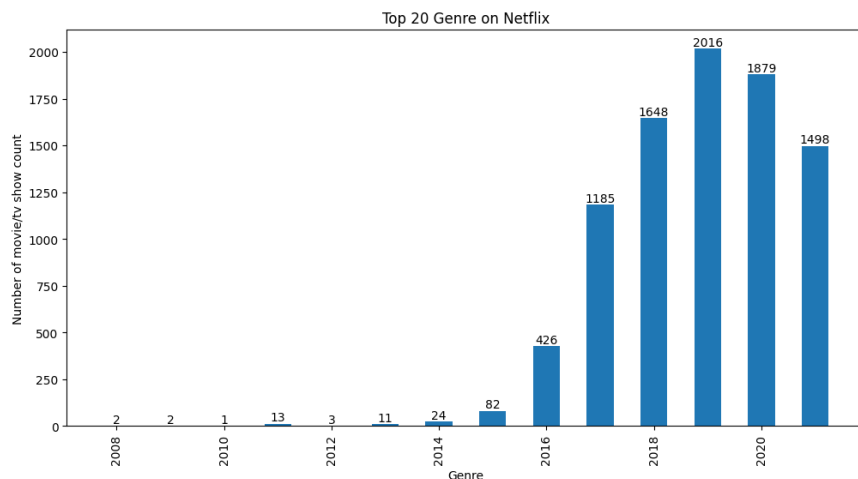
```
Year_counts
```

```
added_year
2019    2016
2020    1879
2018    1648
2021    1498
2017    1185
2016     426
2015      82
2014      24
2011      13
2013      11
2012       3
2008       2
2009       2
2010       1
dtype: int64
```

```
plt.figure(figsize=(12, 6))
bars = plt.bar(Year_counts.index, Year_counts, width = .5)

plt.title("Top 20 Genre on Netflix")
plt.xlabel("Genre")
plt.ylabel("Number of movie/tv show count")
plt.xticks(rotation=90)
plt.show
for bar, count in zip(bars, Year_counts):
    plt.text(bar.get_x() + bar.get_width() / 2, bar.get_height(), count, ha='center', va='bottom')

plt.show()
```



▼ Insights from Netflix Yearly Additions:

Yearly Growth: Netflix experienced substantial growth in content additions over the years, with a significant increase from 2016 to 2020.

Consistent Expansion: The years 2018, 2019, and 2020 witnessed the highest content additions, indicating a consistent effort to expand the streaming library.

Establishment Phase: Earlier years (2011 to 2015) show relatively lower counts, suggesting Netflix's establishment phase and gradual ramp-up of content.

```
cast = netflix['cast']
```

```
netflix.groupby(['rating']).agg({"title": "nunique"})
```

	title	
rating		
G	41	
NC-17	3	
NR	79	
PG	287	
PG-13	490	
R	799	
TV-14	2157	
TV-G	220	
TV-MA	3205	
TV-PG	861	
TV-Y	306	
TV-Y7	333	
TV-Y7-FV	6	

```
df_rating=netflix.groupby(['rating']).agg({"title":"nunique").reset_index().sort_values(by=['title'],ascending=False)[:15]
plt.figure(figsize=(15,8))
plt.barh(df_rating[::1]['rating'], df_rating[::1]['title'],color=['orange'])
plt.xlabel('Frequency by Ratings')
plt.ylabel('Ratings')
plt.show()
```

