

1. Defining Problem Statement and Analysing basic metrics

Definition: To Analyze the data and generate insights that could help Netflix in deciding which type of shows/movies to produce and how they can grow the business in different countries.

```
In [363]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
```

```
In [364]: url='https://d2beiqkhq929f0.cloudfront.net/public_assets/assets/000/000/940/original/netflix.csv'
df=pd.read_csv(url,na_values='NaN')
```

```
In [365]: # Basic metrics
df.head()
```

Out[365]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	duration	listed_in	description
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	September 25, 2021	2020	PG-13	90 min	Documentaries	As her father nears the end of his life, filmm...
1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...	South Africa	September 24, 2021	2021	TV-MA	2 Seasons	International TV Shows, TV Dramas, TV Mysteries	After crossing paths at a party, a Cape Town t...
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...	NaN	September 24, 2021	2021	TV-MA	1 Season	Crime TV Shows, International TV Shows, TV Act...	To protect his family from a powerful drug lor...
3	s4	TV Show	Jailbirds New Orleans	NaN	NaN	NaN	September 24, 2021	2021	TV-MA	1 Season	Docuseries, Reality TV	Feuds, flirtations and toilet talk go down amo...
4	s5	TV Show	Kota Factory	NaN	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K...	India	September 24, 2021	2021	TV-MA	2 Seasons	International TV Shows, Romantic TV Shows, TV ...	In a city of coaching centers known to train l...

```
In [366]: df.tail()
```

Out[366]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	duration	listed_in	description
8802	s8803	Movie	Zodiac	David Fincher	Mark Ruffalo, Jake Gyllenhaal, Robert Downey J...	United States	November 20, 2019	2007	R	158 min	Cult Movies, Dramas, Thrillers	A political cartoonist, a crime reporter and a...
8803	s8804	TV Show	Zombie Dumb	NaN	NaN	NaN	July 1, 2019	2018	TV-Y7	2 Seasons	Kids' TV, Korean TV Shows, TV Comedies	While living alone in a spooky town, a young g...
8804	s8805	Movie	Zombieland	Ruben Fleischer	Jesse Eisenberg, Woody Harrelson, Emma Stone, ...	United States	November 1, 2019	2009	R	88 min	Comedies, Horror Movies	Looking to survive in a world taken over by zo...
8805	s8806	Movie	Zoom	Peter Hewitt	Tim Allen, Courteney Cox, Chevy Chase, Kate Ma...	United States	January 11, 2020	2006	PG	88 min	Children & Family Movies, Comedies	Dragged from civilian life, a former superhero...
8806	s8807	Movie	Zubaan	Mozez Singh	Vicky Kaushal, Sarah-Jane Dias, Raaghav Chanan...	India	March 2, 2019	2015	TV-14	111 min	Dramas, International Movies, Music & Musicals	A scrappy but poor boy worms his way into a ty...

```
In [367]: # Column names
df.columns
```

```
Out[367]: Index(['show_id', 'type', 'title', 'director', 'cast', 'country', 'date_added',
        'release_year', 'rating', 'duration', 'listed_in', 'description'],
        dtype='object')
```

2. Observations on the shape of data, data types of all the attributes, conversion of categorical attributes to 'category' (If required), missing value detection, statistical summary.

```
In [368... # Shape of the data
df.shape
```

```
Out[368]: (8807, 12)
```

```
In [369... # Datatypes of all the attributes with null value detection
df.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
```

```
In [370... # Statistical Summary of Data
df.describe(include='int')
```

```
Out[370]:
```

	release_year
count	8807.000000
mean	2014.180198
std	8.819312
min	1925.000000
25%	2013.000000
50%	2017.000000
75%	2019.000000
max	2021.000000

```
In [371... # Statistical Summary of Data
df.describe(include='object')
```

```
Out[371]:
```

	show_id	type	title	director	cast	country	date_added	rating	duration	listed_in	description
count	8807	8807	8807	6173	7982	7976	8797	8803	8804	8807	8807
unique	8807	2	8807	4528	7692	748	1767	17	220	514	8775
top	s1	Movie	Dick Johnson Is Dead	Rajiv Chilaka	David Attenborough	United States	January 1, 2020	TV-MA	1 Season	Dramas, International Movies	Paranormal activity at a lush, abandoned prope...
freq	1	6131	1	19	19	2818	109	3207	1793	362	4

```
In [372... # Column wise null values
df.isna().sum()
```

```
Out[372]: 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
```

```
In [373... # Null values of duration column
df.loc[df['duration'].isna()]
```

Out[373]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	duration	listed_in	description
5541	s5542	Movie	Louis C.K. 2017	Louis C.K.	Louis C.K.	United States	April 4, 2017	2017	74 min	NaN	Movies	Louis C.K. muses on religion, eternal love, gi...
5794	s5795	Movie	Louis C.K.: Hilarious	Louis C.K.	Louis C.K.	United States	September 16, 2016	2010	84 min	NaN	Movies	Emmy-winning comedy writer Louis C.K. brings h...
5813	s5814	Movie	Louis C.K.: Live at the Comedy Store	Louis C.K.	Louis C.K.	United States	August 15, 2016	2015	66 min	NaN	Movies	The comic puts his trademark hilarious/thought...

As we observe above three duration column values have been interchanged with rating column values, rectified the same correction in the below code.

In [374...

```
df['duration'][df['duration'].isna()] = df['rating'][df['duration'].isna()]
df['duration']=df['duration'].apply(lambda x:str(x).split()[0])
df['duration']=df['duration'].astype(int)
df
```

C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\3956682623.py:1: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

```
df['duration'][df['duration'].isna()] = df['rating'][df['duration'].isna()]
```

Out[374]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	duration	listed_in	description
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	September 25, 2021	2020	PG-13	90	Documentaries	As her father nears the end of his life, filmm...
1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...	South Africa	September 24, 2021	2021	TV-MA	2	International TV Shows, TV Dramas, TV Mysteries	After crossing paths at a party, a Cape Town t...
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...	NaN	September 24, 2021	2021	TV-MA	1	Crime TV Shows, International TV Shows, TV Act...	To protect his family from a powerful drug lor...
3	s4	TV Show	Jailbirds New Orleans	NaN	NaN	NaN	September 24, 2021	2021	TV-MA	1	Docuseries, Reality TV	Feuds, flirtations and toilet talk go down amo...
4	s5	TV Show	Kota Factory	NaN	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K...	India	September 24, 2021	2021	TV-MA	2	International TV Shows, Romantic TV Shows, TV ...	In a city of coaching centers known to train l...
...
8802	s8803	Movie	Zodiac	David Fincher	Mark Ruffalo, Jake Gyllenhaal, Robert Downey J...	United States	November 20, 2019	2007	R	158	Cult Movies, Dramas, Thrillers	A political cartoonist, a crime reporter and a...
8803	s8804	TV Show	Zombie Dumb	NaN	NaN	NaN	July 1, 2019	2018	TV-Y7	2	Kids' TV, Korean TV Shows, TV Comedies	While living alone in a spooky town, a young g...
8804	s8805	Movie	Zombieland	Ruben Fleischer	Jesse Eisenberg, Woody Harrelson, Emma Stone, ...	United States	November 1, 2019	2009	R	88	Comedies, Horror Movies	Looking to survive in a world taken over by zo...
8805	s8806	Movie	Zoom	Peter Hewitt	Tim Allen, Courteney Cox, Chevy Chase, Kate Ma...	United States	January 11, 2020	2006	PG	88	Children & Family Movies, Comedies	Dragged from civilian life, a former superhero...
8806	s8807	Movie	Zubaan	Mozez Singh	Vicky Kaushal, Sarah-Jane Dias, Raaghav Chanan...	India	March 2, 2019	2015	TV-14	111	Dramas, International Movies, Music & Musicals	A scrappy but poor boy worms his way into a ty...

8807 rows × 12 columns

In [375...

```
df.isna().sum() #As a result, duration column has no null values.
```

Out[375]:

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

In [545...

```
#conversion of categorical attributes to 'category'
df['date_added'] = pd.to_datetime(df["date_added"])
```

3. Non-Graphical Analysis: Value counts and unique attributes &

4. Visual Analysis - Univariate, Bivariate after pre-processing of the data &

6. Insights based on Non-Graphical and Visual Analysis with comments.

```
In [376... # column wise unique count
df.nunique()

Out[376]: show_id      8807
type          2
title         8807
director      4528
cast          7692
country       748
date_added    1767
release_year   74
rating        17
duration      210
listed_in     514
description   8775
dtype: int64

In [377... df['type'].nunique()

Out[377]: 2

In [378... df['type'].value_counts()

Out[378]: Movie      6131
TV Show   2676
Name: type, dtype: int64

In [379... df[df['type']=='Movie']['duration'].describe()

Out[379]: count      6131.000000
mean        99.564998
std         28.289504
min          3.000000
25%         87.000000
50%         98.000000
75%        114.000000
max         312.000000
Name: duration, dtype: float64
```

Unnesting of cast column

```
In [380... cast_data=df[["title","cast"]]
cast_data["cast"]=cast_data["cast"].str.split(", ")
df_cast=cast_data.explode("cast")
df_cast.replace("nan",
                np.nan, inplace=True)
df_cast.dropna(inplace=True)
df_cast

C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\768506992.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy
cast_data["cast"]=cast_data["cast"].str.split(", ")

Out[380]:
```

	title	cast
1	Blood & Water	Ama Qamata
1	Blood & Water	Khosi Ngema
1	Blood & Water	Gail Mabalane
1	Blood & Water	Thabang Molaba
1	Blood & Water	Dillon Windvogel
...
8806	Zubaan	Manish Chaudhary
8806	Zubaan	Meghna Malik
8806	Zubaan	Malkeet Rauni
8806	Zubaan	Anita Shabdish
8806	Zubaan	Chittaranjan Tripathy

64126 rows × 2 columns

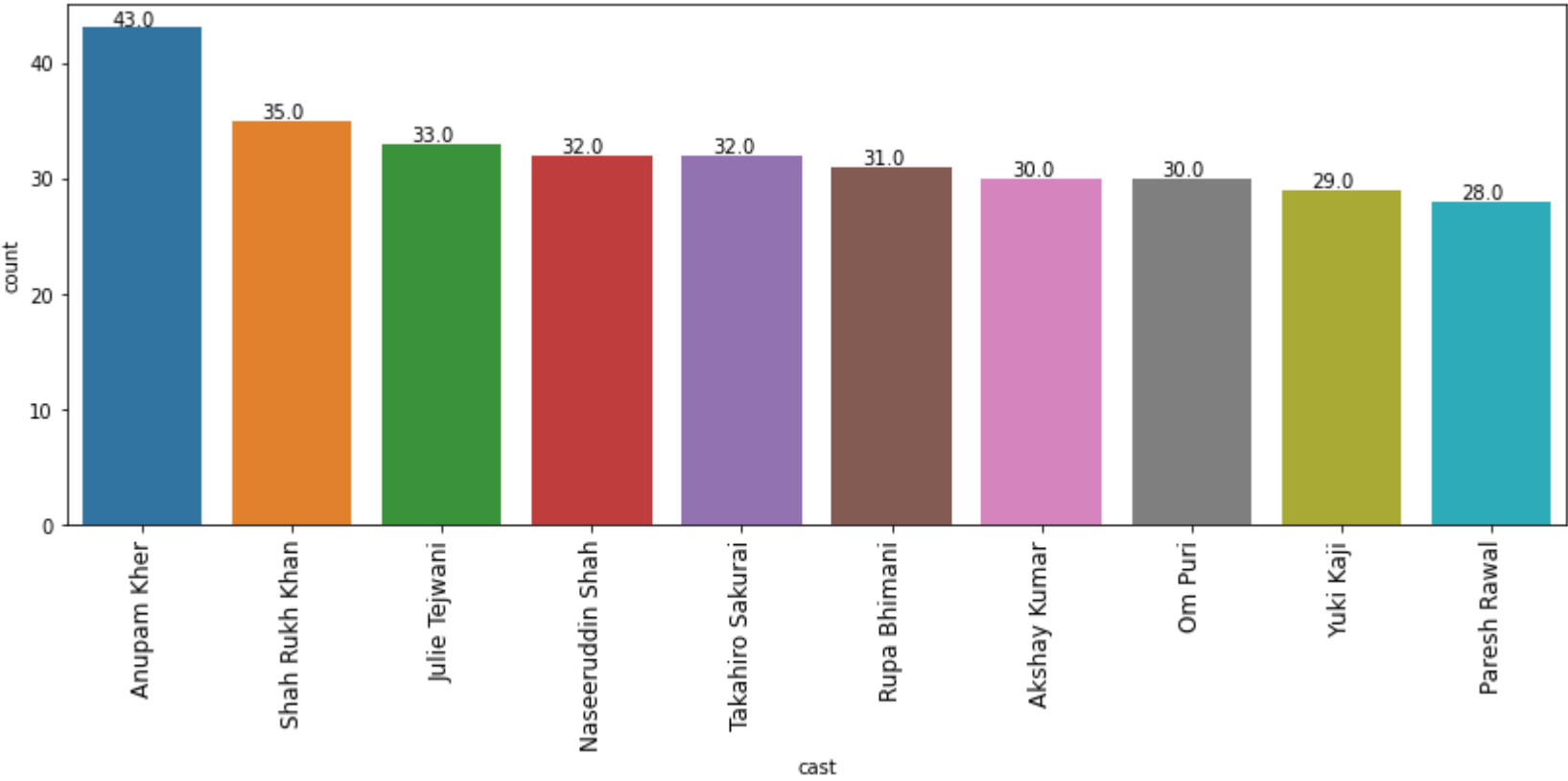
```
In [381... # Value counts of cast column
df_cast['cast'].value_counts()

Out[381]: Anupam Kher          43
Shah Rukh Khan          35
Julie Teiwani           33
Naseeruddin Shah        32
Takahiro Sakurai        32
..
Maryam Zaree            1
Melanie Straub          1
Gabriela Maria Schmeide  1
Helena Zengel           1
Chittaranjan Tripathy    1
Name: cast, Length: 36439, dtype: int64
```

Uni-variate Analysis

```
In [382... fig=plt.figure(figsize=(14,5))

a=sns.countplot(x=df_cast["cast"],
order=df_cast["cast"].value_counts().index[0:10])
plt.xticks(rotation=90,fontsize=12)
for p in a.patches:
    a.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.20, p.get_height()+0.25))
plt.show()
```



Comment: Anupam Kher has acted in highest number of Netflix(Movies/TV shows)

```
In [383... # Unique count of cast
df_cast.nunique()
```

```
Out[383]: title      7982
cast      36439
dtype: int64
```

```
In [384... # Total count
df_cast.value_counts().sum()
```

```
Out[384]: 64126
```

Unnesting of director column

```
In [385... dir_data=df[["title","director"]]
dir_data["director"]=dir_data["director"].str.split(", ")
df_dir=df_data.explode("director")
df_dir.replace("nan",
np.nan, inplace=True)
df_dir.dropna(inplace=True)
df_dir
```

C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\2311497627.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy
dir_data["director"]=dir_data["director"].str.split(", ")

Out[385]:

	title	director
0	Dick Johnson Is Dead	Kirsten Johnson
2	Ganglands	Julien Leclercq
5	Midnight Mass	Mike Flanagan
6	My Little Pony: A New Generation	Robert Cullen
6	My Little Pony: A New Generation	José Luis Ucha
...
8801	Zinzana	Majid Al Ansari
8802	Zodiac	David Fincher
8804	Zombieland	Ruben Fleischer
8805	Zoom	Peter Hewitt
8806	Zubaan	Mozez Singh

6978 rows × 2 columns

In [386...

```
# Value counts of director
df_dir['director'].value_counts()
```

Out[386]:

Rajiv Chilaka	22
Jan Suter	21
Raúl Campos	19
Suhas Kadav	16
Marcus Raboy	16
..	
Raymie Muzquiz	1
Stu Livingston	1
Joe Menendez	1
Eric Bross	1
Mozez Singh	1

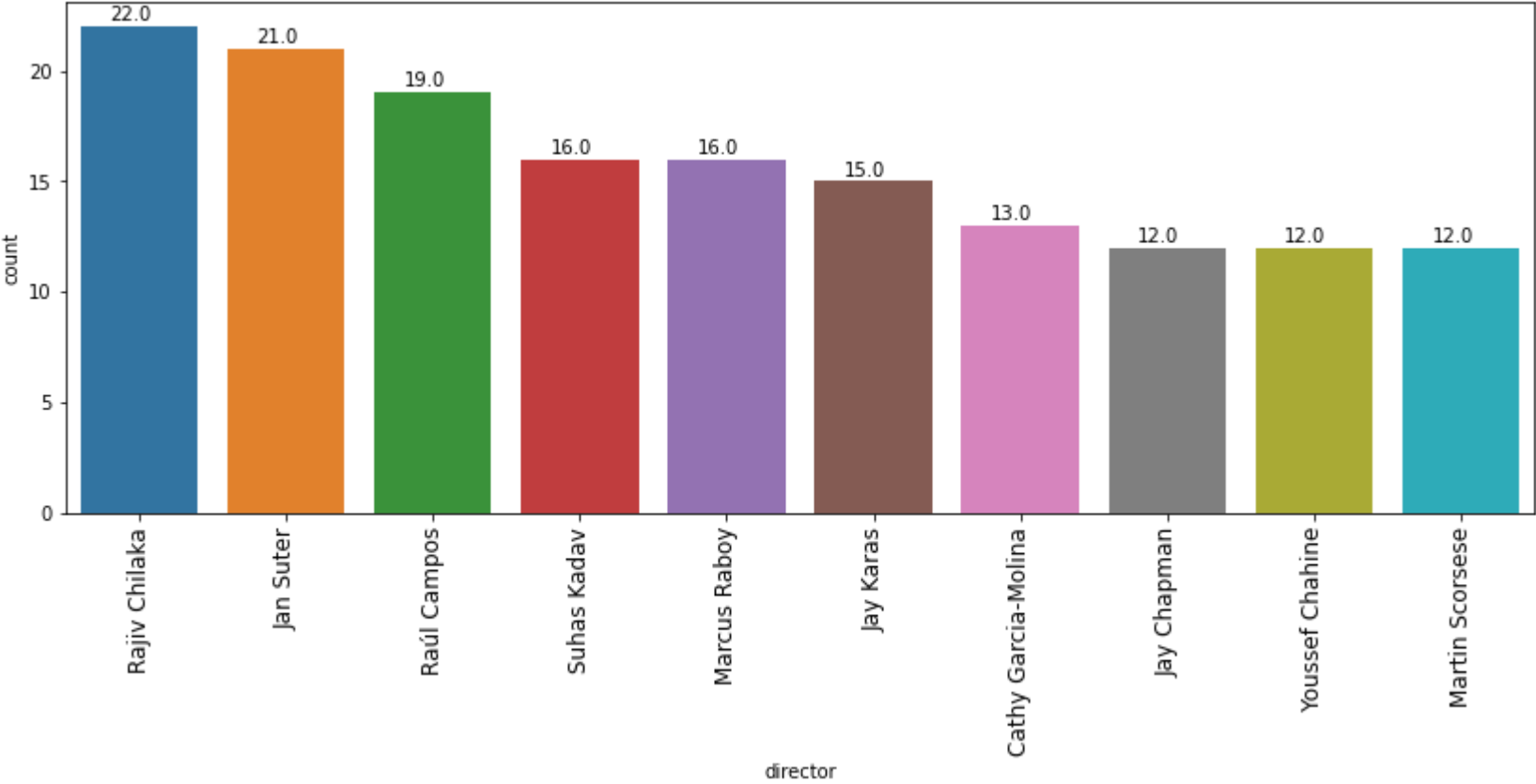
Name: director, Length: 4993, dtype: int64

Uni-variate Analysis

In [387...

```
fig=plt.figure(figsize=(14,5))

a=sns.countplot(x=df_dir["director"],
order=df_dir["director"].value_counts().index[0:10])
plt.xticks(rotation=90,fontsize=12)
for p in a.patches:
a.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.20, p.get_height()+0.25))
plt.show()
```



Comment- Rajiv Chilaka has been directed highest number of Netflix(Movies/ TV Shows).

In [388...

```
# Unique count of director
df_dir.nunique()
```

Out[388]:

title	6173
director	4993

dtype: int64

In [389...

```
# Total count
df_dir.value_counts().sum()
```

Out[389]:

6978

Unnesting of country column

In [390...

```
cy_data=df[["title","country"]]
cy_data["country"]=cy_data["country"].str.split(", ")
df_cy=cy_data.explode("country")
df_cy.replace("nan",
              np.nan, inplace=True)
df_cy.dropna(inplace=True)
df_cy

C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\3787550946.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy
cy_data["country"]=cy_data["country"].str.split(", ")
```

Out[390]:

	title	country
0	Dick Johnson Is Dead	United States
1	Blood & Water	South Africa
4	Kota Factory	India
7	Sankofa	United States
7	Sankofa	Ghana
...
8801	Zinzana	Jordan
8802	Zodiac	United States
8804	Zombieland	United States
8805	Zoom	United States
8806	Zubaan	India

10014 rows × 2 columns

In [391...

```
# Value counts of country
df_cy['country'].value_counts()
```

Out[391]:

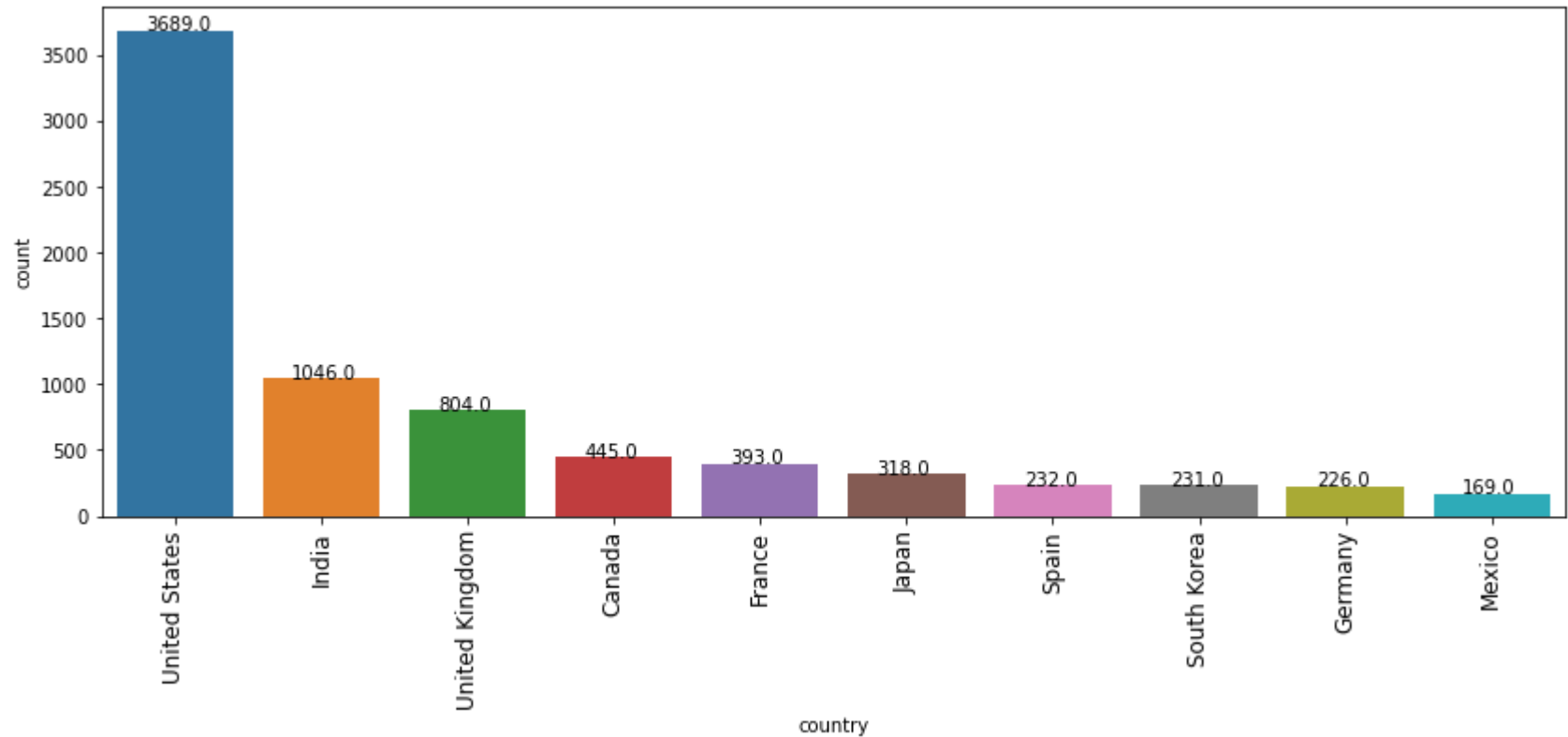
```
United States    3689
India            1046
United Kingdom    804
Canada           445
France           393
...
Bermuda          1
Ecuador          1
Armenia          1
Mongolia         1
Montenegro       1
Name: country, Length: 127, dtype: int64
```

Uni-variate Analysis

In [392...

```
fig=plt.figure(figsize=(14,5))

a=sns.countplot(x=df_cy["country"],
                order=df_cy["country"].value_counts().index[0:10])
plt.xticks(rotation=90,fontsize=12)
for p in a.patches:
    a.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.20, p.get_height()+0.45))
plt.show()
```

Comment- United States has highest number of Netflix(Movies/ TV Shows).

```
In [393... df_cy['country'].value_counts()
```

```
Out[393]: United States    3689
India              1046
United Kingdom     804
Canada             445
France             393
...
Bermuda            1
Ecuador            1
Armenia            1
Mongolia           1
Montenegro         1
Name: country, Length: 127, dtype: int64
```

```
In [394... # Unique values of country
df_cy['country'].unique()
```

```
Out[394]: array(['United States', 'South Africa', 'India', 'Ghana', 'Burkina Faso',
        'United Kingdom', 'Germany', 'Ethiopia', 'Czech Republic',
        'Mexico', 'Turkey', 'Australia', 'France', 'Finland', 'China',
        'Canada', 'Japan', 'Nigeria', 'Spain', 'Belgium', 'South Korea',
        'Singapore', 'Italy', 'Romania', 'Argentina', 'Venezuela',
        'Hong Kong', 'Russia', '', 'Ireland', 'Nepal', 'New Zealand',
        'Brazil', 'Greece', 'Jordan', 'Colombia', 'Switzerland', 'Israel',
        'Taiwan', 'Bulgaria', 'Algeria', 'Poland', 'Saudi Arabia',
        'Thailand', 'Indonesia', 'Egypt', 'Denmark', 'Kuwait',
        'Netherlands', 'Malaysia', 'Vietnam', 'Hungary', 'Sweden',
        'Lebanon', 'Syria', 'Philippines', 'Iceland',
        'United Arab Emirates', 'Norway', 'Qatar', 'Mauritius', 'Austria',
        'Cameroon', 'Palestine', 'Uruguay', 'United Kingdom,', 'Kenya',
        'Chile', 'Luxembourg', 'Cambodia', 'Bangladesh', 'Portugal',
        'Cayman Islands', 'Senegal', 'Serbia', 'Malta', 'Namibia',
        'Angola', 'Peru', 'Mozambique', 'Cambodia,', 'Belarus', 'Zimbabwe',
        'Puerto Rico', 'Pakistan', 'Cyprus', 'Guatemala', 'Iraq', 'Malawi',
        'Paraguay', 'Croatia', 'Iran', 'West Germany', 'United States,',
        'Albania', 'Georgia', 'Soviet Union', 'Morocco', 'Slovakia',
        'Ukraine', 'Bermuda', 'Ecuador', 'Armenia', 'Mongolia', 'Bahamas',
        'Sri Lanka', 'Latvia', 'Liechtenstein', 'Cuba', 'Nicaragua',
        'Poland,', 'Slovenia', 'Dominican Republic', 'Samoa', 'Azerbaijan',
        'Botswana', 'Vatican City', 'Jamaica', 'Kazakhstan', 'Lithuania',
        'Afghanistan', 'Somalia', 'Sudan', 'Panama', 'Uganda',
        'East Germany', 'Montenegro'], dtype=object)
```

```
In [395... # Unique count of country
df_cy.nunique()
```

```
Out[395]: title      7976
country    127
dtype: int64
```

Unnesting of Listed_in column

```
In [396... li_data=df[["title","listed_in"]]
li_data["listed_in"]=li_data["listed_in"].str.split(", ")
df_li=li_data.explode("listed_in")
df_li.replace("nan",
              np.nan, inplace=True)
df_li.dropna(inplace=True)
df_li
```

C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\2075411862.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy

```
li_data["listed_in"]=li_data["listed_in"].str.split(", ")
```

Out[396]:

	title	listed_in
0	Dick Johnson Is Dead	Documentaries
1	Blood & Water	International TV Shows
1	Blood & Water	TV Dramas
1	Blood & Water	TV Mysteries
2	Ganglands	Crime TV Shows
...
8805	Zoom	Children & Family Movies
8805	Zoom	Comedies
8806	Zubaan	Dramas
8806	Zubaan	International Movies
8806	Zubaan	Music & Musicals

19323 rows × 2 columns

In [397...

```
# Value counts of Listed_in  
df_li['listed_in'].value_counts()
```

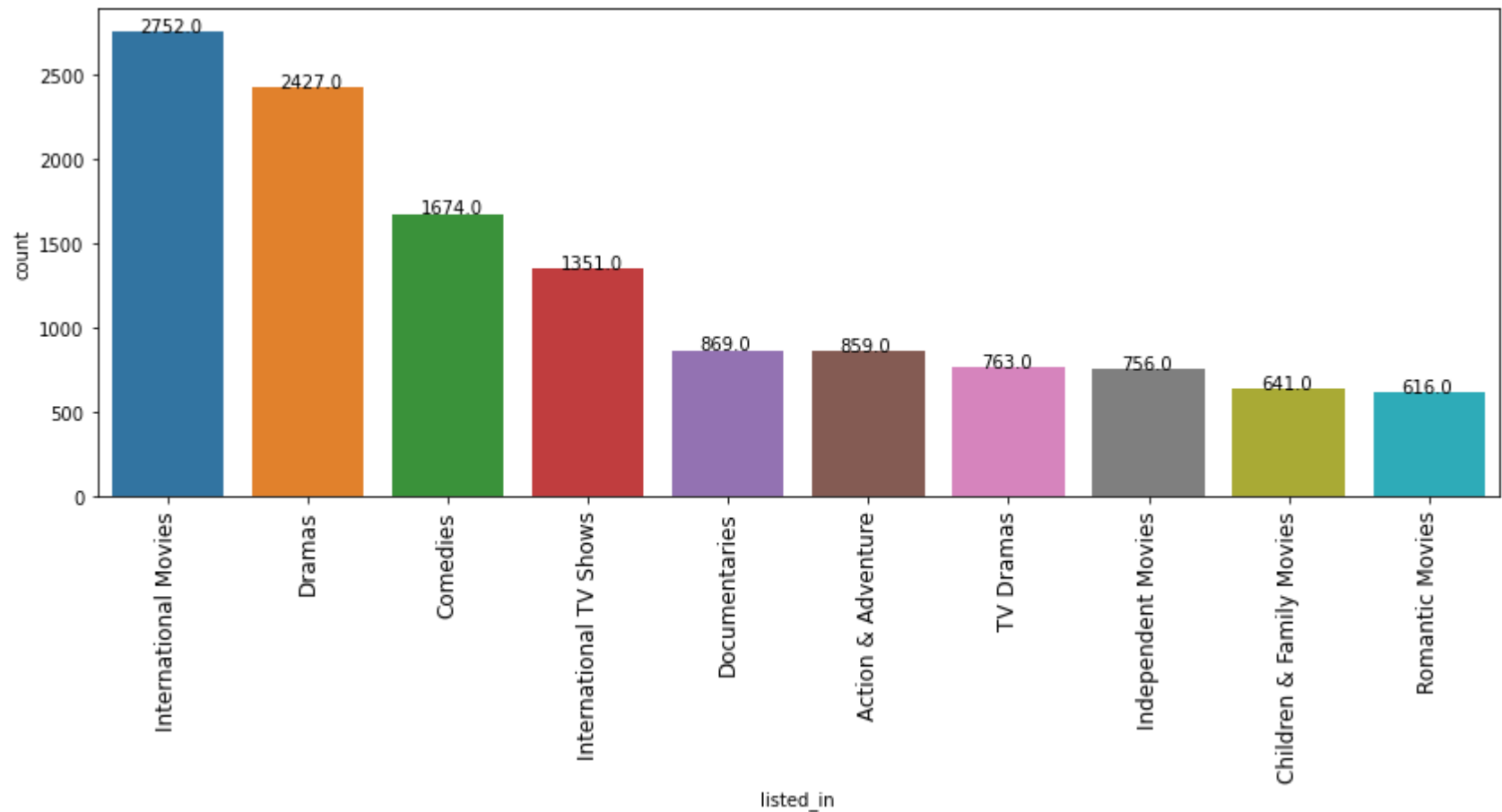
Out[397]:

```
International Movies    2752  
Dramas                 2427  
Comedies               1674  
International TV Shows 1351  
Documentaries          869  
Action & Adventure     859  
TV Dramas              763  
Independent Movies     756  
Children & Family Movies 641  
Romantic Movies        616  
TV Comedies            581  
Thrillers              577  
Crime TV Shows         470  
Kids' TV               451  
Docuseries             395  
Music & Musicals        375  
Romantic TV Shows      370  
Horror Movies          357  
Stand-Up Comedy        343  
Reality TV             255  
British TV Shows       253  
Sci-Fi & Fantasy        243  
Sports Movies          219  
Anime Series           176  
Spanish-Language TV Shows 174  
TV Action & Adventure   168  
Korean TV Shows        151  
Classic Movies         116  
LGBTQ Movies           102  
TV Mysteries           98  
Science & Nature TV    92  
TV Sci-Fi & Fantasy     84  
TV Horror              75  
Anime Features         71  
Cult Movies            71  
Teen TV Shows          69  
Faith & Spirituality    65  
TV Thrillers           57  
Movies                 57  
Stand-Up Comedy & Talk Shows 56  
Classic & Cult TV       28  
TV Shows               16  
Name: listed_in, dtype: int64
```

Uni-variate Analysis

In [398...

```
fig=plt.figure(figsize=(14,5))  
  
a=sns.countplot(x=df_li["listed_in"],  
                order=df_li["listed_in"].value_counts().index[0:10])  
plt.xticks(rotation=90,fontsize=12)  
for p in a.patches:  
    a.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.20, p.get_height()+0.75))  
plt.show()
```



Comment- The highest number of Netflix[Movies/TV shows] is listed in International Movies category.

```
In [399... # Unique values of listed_in
df_li['listed_in'].unique()

Out[399]: array(['Documentaries', 'International TV Shows', 'TV Dramas',
      'TV Mysteries', 'Crime TV Shows', 'TV Action & Adventure',
      'Docuseries', 'Reality TV', 'Romantic TV Shows', 'TV Comedies',
      'TV Horror', 'Children & Family Movies', 'Dramas',
      'Independent Movies', 'International Movies', 'British TV Shows',
      'Comedies', 'Spanish-Language TV Shows', 'Thrillers',
      'Romantic Movies', 'Music & Musicals', 'Horror Movies',
      'Sci-Fi & Fantasy', 'TV Thrillers', "Kids' TV",
      'Action & Adventure', 'TV Sci-Fi & Fantasy', 'Classic Movies',
      'Anime Features', 'Sports Movies', 'Anime Series',
      'Korean TV Shows', 'Science & Nature TV', 'Teen TV Shows',
      'Cult Movies', 'TV Shows', 'Faith & Spirituality', 'LGBTQ Movies',
      'Stand-Up Comedy', 'Movies', 'Stand-Up Comedy & Talk Shows',
      'Classic & Cult TV'], dtype=object)

In [400... # Unique count of Listed in column
df_li.nunique()

Out[400]: title      8807
listed_in    42
dtype: int64

In [401... #Total count
df_li.value_counts().sum()

Out[401]: 19323

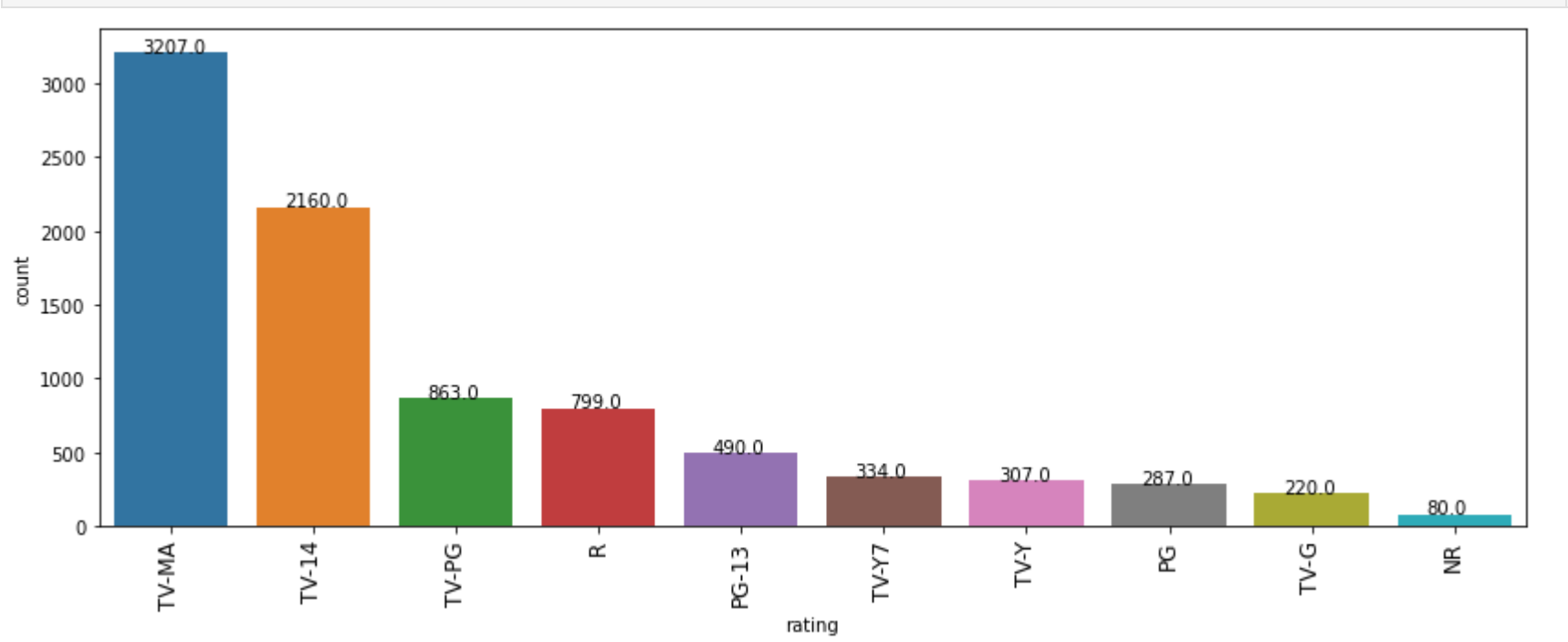
In [402... # Value counts of Rating
df['rating'].value_counts()

Out[402]: TV-MA      3207
TV-14      2160
TV-PG       863
R           799
PG-13       490
TV-Y7       334
TV-Y        307
PG          287
TV-G        220
NR           80
G           41
TV-Y7-FV     6
NC-17        3
UR           3
74 min       1
84 min       1
66 min       1
Name: rating, dtype: int64
```

Uni-Variate Analysis

```
In [403... fig=plt.figure(figsize=(14,5))

a=sns.countplot(x=df["rating"],
order=df["rating"].value_counts().index[0:10])
plt.xticks(rotation=90,fontsize=12)
for p in a.patches:
    a.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.20, p.get_height()+2.95))
plt.show()
```



Comment- The highest rating of Netflix[Movies/TV Shows] is 'TV-MA'.

```
In [404... # Unique values of Rating
df['rating'].unique()

Out[404]: array(['PG-13', 'TV-MA', 'PG', 'TV-14', 'TV-PG', 'TV-Y', 'TV-Y7', 'R',
      'TV-G', 'G', 'NC-17', '74 min', '84 min', '66 min', 'NR', nan,
      'TV-Y7-FV', 'UR'], dtype=object)

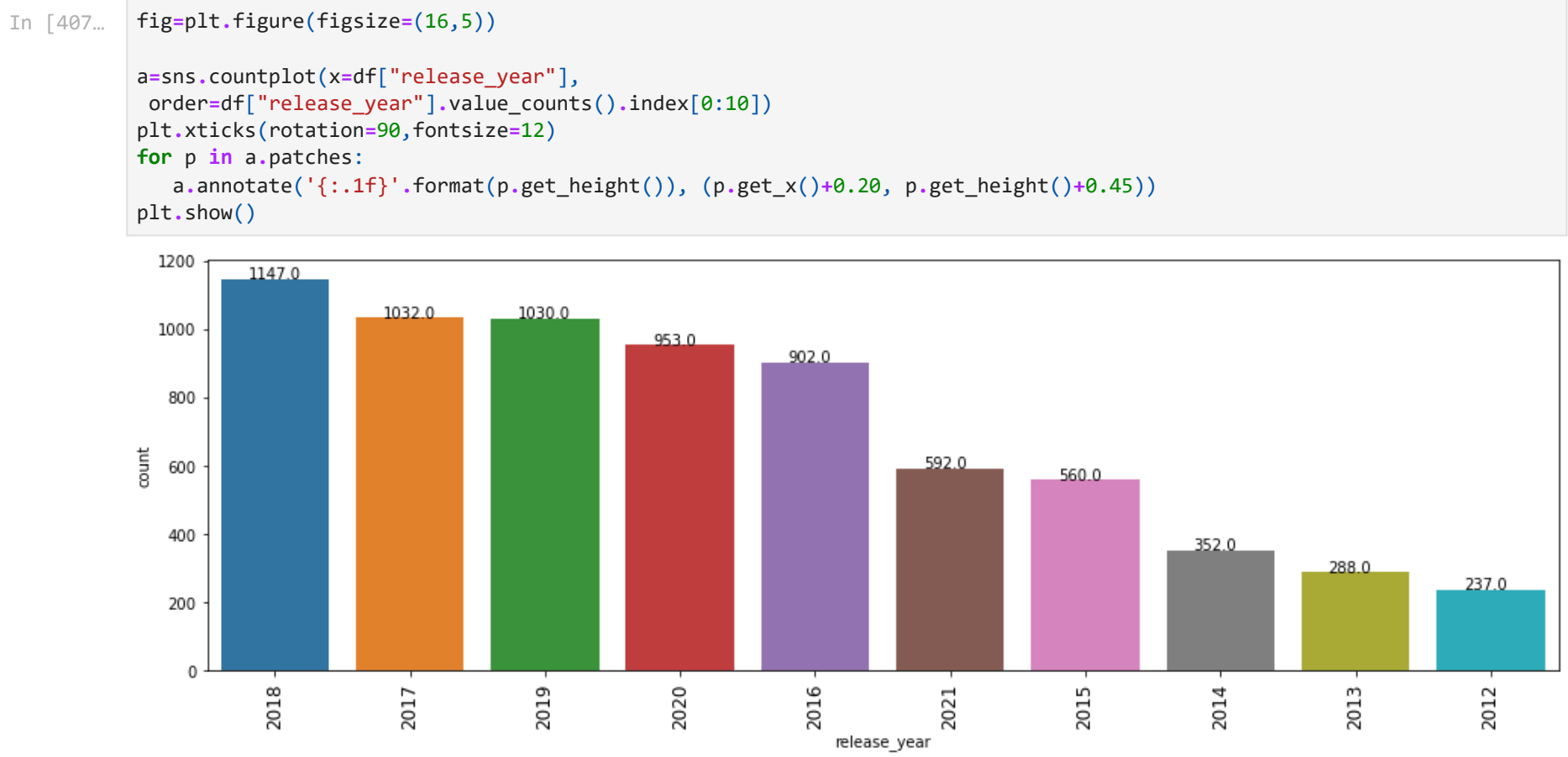
In [405... # Unique count of Rating
df['rating'].nunique()

Out[405]: 17

In [406... # Value counts of release year
df['release_year'].value_counts()

Out[406]: 2018    1147
2017    1032
2019    1030
2020     953
2016     902
...
1959         1
1925         1
1961         1
1947         1
1966         1
Name: release_year, Length: 74, dtype: int64
```

Uni-Variate Analysis



Comment- The Highest number of Netflix[Movies/TV Shows] have been released on 2018 year.

```
In [408... # Unique values of release_year
df['release_year'].unique()
```

Out[408]: array([2020, 2021, 1993, 2018, 1996, 1998, 1997, 2010, 2013, 2017, 1975, 1978, 1983, 1987, 2012, 2001, 2014, 2002, 2003, 2004, 2011, 2008, 2009, 2007, 2005, 2006, 1994, 2015, 2019, 2016, 1982, 1989, 1990, 1991, 1999, 1986, 1992, 1984, 1980, 1961, 2000, 1995, 1985, 1976, 1959, 1988, 1981, 1972, 1964, 1945, 1954, 1979, 1958, 1956, 1963, 1970, 1973, 1925, 1974, 1960, 1966, 1971, 1962, 1969, 1977, 1967, 1968, 1965, 1946, 1942, 1955, 1944, 1947, 1943], dtype=int64)

In [409...
Unique count of release_year
df['release_year'].nunique()

Out[409]: 74

Unnesting of Title, Cast and Type

In [410...
tc1=df[["title","cast","type"]]
tc1["cast"]=tc1["cast"].str.split(", ")
tc=tc1.explode("cast")
tc.replace("nan",
 np.nan, inplace=True)
tc.dropna(inplace=True)
tc

C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\1882680494.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy
tc1["cast"]=tc1["cast"].str.split(", ")

Out[410]:

	title	cast	type
1	Blood & Water	Ama Qamata	TV Show
1	Blood & Water	Khosi Ngema	TV Show
1	Blood & Water	Gail Mabalane	TV Show
1	Blood & Water	Thabang Molaba	TV Show
1	Blood & Water	Dillon Windvogel	TV Show
...
8806	Zubaan	Manish Chaudhary	Movie
8806	Zubaan	Meghna Malik	Movie
8806	Zubaan	Malkeet Rauni	Movie
8806	Zubaan	Anita Shabdish	Movie
8806	Zubaan	Chittaranjan Tripathy	Movie

64126 rows × 3 columns

In [411...
tc[tc['type']=='Movie']['cast'].value_counts()

Out[411]:

Anupam Kher	42
Shah Rukh Khan	35
Naseeruddin Shah	32
Akshay Kumar	30
Om Puri	30
..	..
Sushma Bakshi	1
Yusuf Hussain	1
Amarjeet Amle	1
Priya	1
Chittaranjan Tripathy	1

Name: cast, Length: 25951, dtype: int64

In [412...
tc[tc['type']=='Movie']['cast'].value_counts().sum()

Out[412]: 44475

In [413...
tc[tc['type']=='TV Show']['cast'].value_counts()

Out[413]:

Takahiro Sakurai	25
Yuki Kaji	19
Daisuke Ono	17
Junichi Suwabe	17
Ai Kayano	17
..	..
Bhumibhat Thavornsiri	1
Thanongsak Suphakan	1
Kanjanaporn Plodpai	1
Boonsong Nakphoo	1
Hina Khawaja Bayat	1

Name: cast, Length: 14863, dtype: int64

In [414...
tc[tc['type']=='TV Show']['cast'].value_counts().sum()

Out[414]: 19651

```
In [415... tc[tc['type']=='Movie']['cast'].unique()

Out[415]: array(['Vanessa Hudgens', 'Kimiko Glenn', 'James Marsden', ...,
      'Malkeet Rauni', 'Anita Shabdish', 'Chittaranjan Tripathy'],
      dtype=object)

In [416... tc[tc['type']=='Movie']['cast'].nunique()

Out[416]: 25951

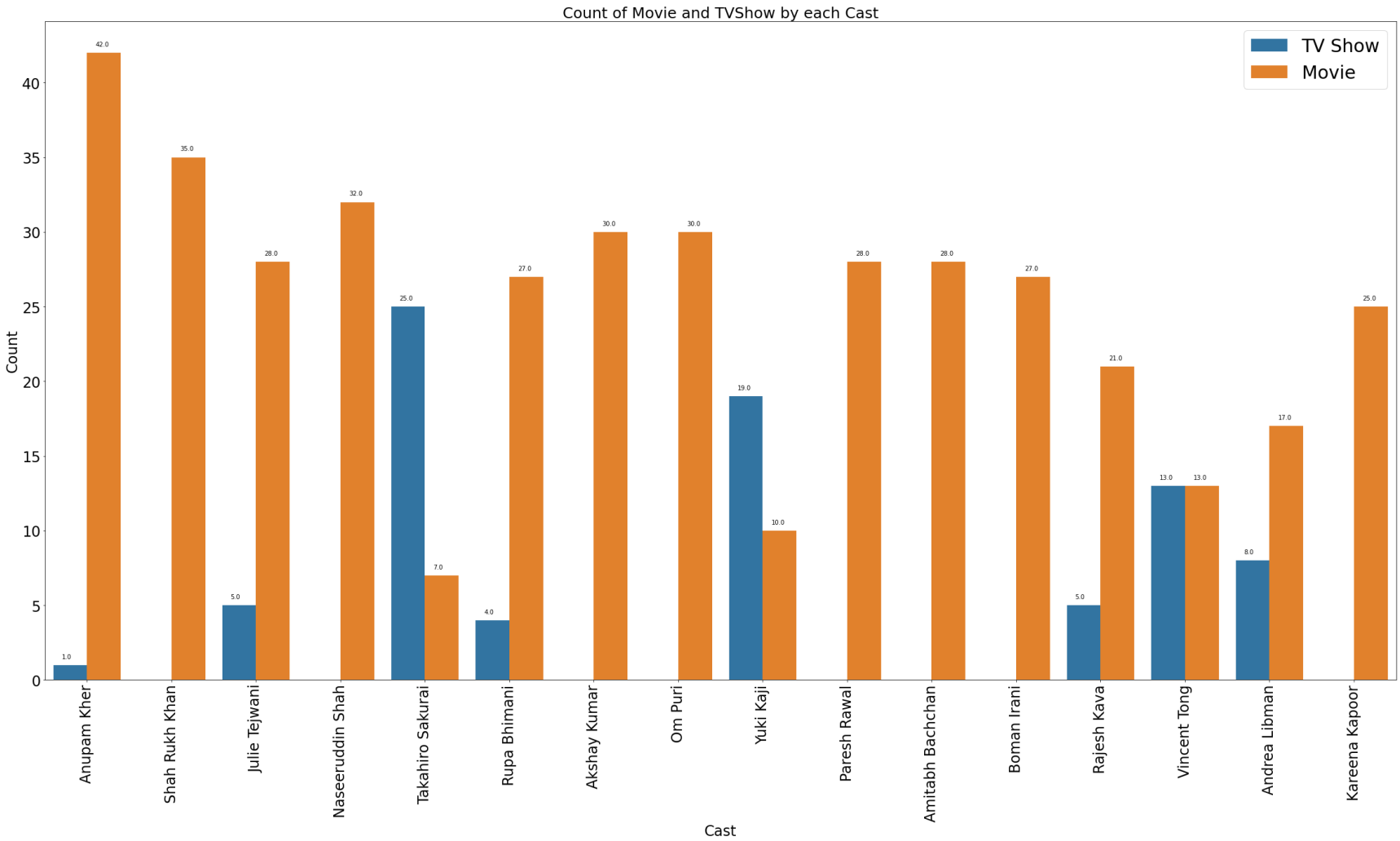
In [417... tc[tc['type']=='TV Show']['cast'].nunique()

Out[417]: 14863
```

Bi- Variate Analysis

```
In [418... plt.figure(figsize=(40,20))
plt.title('Count of Movie and TVShow by each Cast', fontsize=25)
a=sns.countplot(x="cast", data=tc, order=tc['cast'].value_counts().index[0:16],hue="type")
plt.xticks(rotation=90,fontsize=24)
plt.yticks(fontsize=24)
plt.xlabel('Cast',size=24)
plt.ylabel('Count',size=24)
plt.legend(loc="upper right", frameon=True, fontsize=30)
for p in a.patches:
    a.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.10, p.get_height()+0.45))

plt.show()
```



Comment- The highest number of movies has been casted by 'Anupam Kher' where as the highest number of TV shows has been casted by 'Takahiro Sakurai'.

Unnesting of Title, Director and Type

```
In [419... td1=df[["title","director","type"]]
td1["director"]=td1["director"].str.split(", ")
td=td1.explode("director")
td.replace("nan",
          np.nan, inplace=True)
td.dropna(inplace=True)
td

C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\496677526.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy
td1["director"]=td1["director"].str.split(", ")
```

Out[419]:

	title	director	type
0	Dick Johnson Is Dead	Kirsten Johnson	Movie
2	Ganglands	Julien Leclercq	TV Show
5	Midnight Mass	Mike Flanagan	TV Show
6	My Little Pony: A New Generation	Robert Cullen	Movie
6	My Little Pony: A New Generation	José Luis Ucha	Movie
...
8801	Zinzana	Majid Al Ansari	Movie
8802	Zodiac	David Fincher	Movie
8804	Zombieland	Ruben Fleischer	Movie
8805	Zoom	Peter Hewitt	Movie
8806	Zubaan	Mozez Singh	Movie

6978 rows × 3 columns

In [420...

td[td['type']=='Movie']['director'].value_counts()

Out[420]:

Rajiv Chilaka22
Jan Suter21
Raúl Campos19
Suhas Kadav16
Marcus Raboy15
..
Vrinda Samartha1
Nicholaus Goossen1
Stig Bergqvist1
Paul Demeyer1
Mozez Singh1
Name: director, Length: 4777, dtype: int64

In [421...

td[td['type']=='Movie']['director'].value_counts().sum()

Out[421]:

6666

In [422...

td[td['type']=='TV Show']['director'].value_counts()

Out[422]:

Alastair Fothergill3
Ken Burns3
Jung-ah Im2
Gautham Vasudev Menon2
Iginio Straffi2
..
Jesse Vile1
Ellena Wood1
Picky Talarico1
Pedro Waddington1
Michael Cumming1
Name: director, Length: 299, dtype: int64

In [423...

td[td['type']=='TV Show']['director'].value_counts().sum()

Out[423]:

312

In [424...

td[td['type']=='Movie']['director'].nunique()

Out[424]:

4777

In [425...

td[td['type']=='TV Show']['director'].nunique()

Out[425]:

299

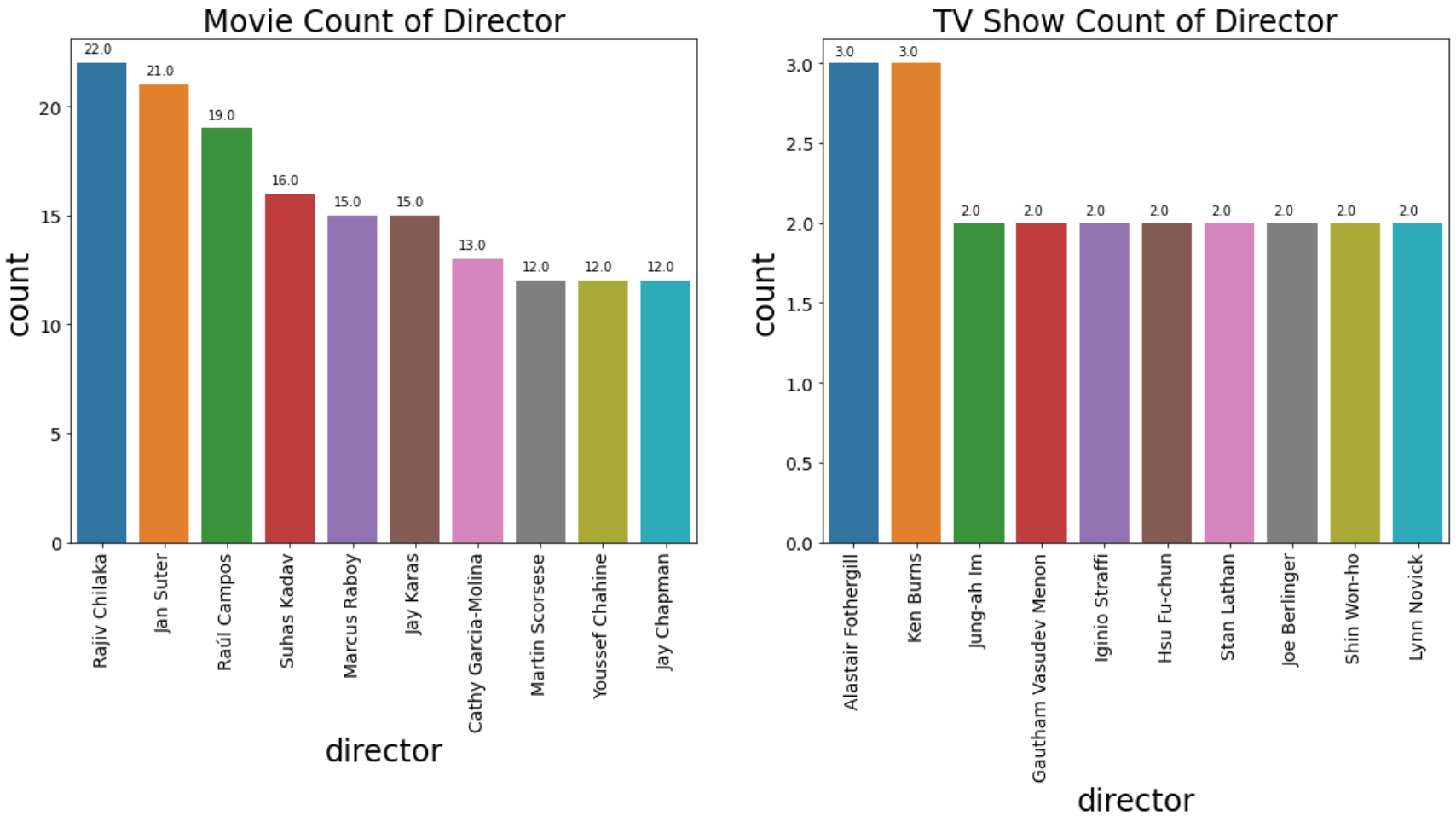
Bi- Variate Analysis

In [426...

plt.figure(figsize=(30,16))
plt.subplot(2, 3, 1)

plt.xlabel("Director")
plt.ylabel(" Movie count")
plt.xticks(rotation=90,fontsize=14)
plt.yticks(fontsize=14)
plt.xlabel('Director',size=24)
plt.ylabel('Count',size=24)
plt.title("Movie Count of Director", fontsize=24);
a=sns.countplot(x="director", data=td[td["type"]=="Movie"], order=td[td['type']=='Movie']['director'].value_counts().in
for p in a.patches:
 a.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.10, p.get_height()+0.45))
plt.subplot(2, 3, 2)
plt.xlabel("Director")
plt.ylabel("TV Show")
plt.xlabel('Director',size=24)
plt.ylabel('Count',size=24)
plt.xticks(rotation=90,fontsize=14)

```
plt.yticks(fontsize=14)
plt.title("TV Show Count of Director",fontsize=24);
b=sns.countplot(x="director", data=td[td["type"]=="TV Show"], order=td[td['type']=='TV Show']['director'].value_counts(
for p in b.patches:
    b.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.10, p.get_height()+0.05))
plt.show()
```



Comment- The highest number of Movies has been directed by 'Rajiv Chilaka' whereas highest number of TV shows have been directed by 'Alastair Fothergill' and 'Ken Burns'.

Unnesting of Title, Country and Type

In [427...]

```
tcyl=df[["title","country","type"]]
tcyl["country"]=tcyl["country"].str.split(", ")
tcy=tcyl.explode("country")
tcy.replace("nan",
            np.nan, inplace=True)
tcy.dropna(inplace=True)
tcy
```

C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\792483585.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy

```
tcyl["country"]=tcyl["country"].str.split(", ")
```

Out[427]:

	title	country	type
0	Dick Johnson Is Dead	United States	Movie
1	Blood & Water	South Africa	TV Show
4	Kota Factory	India	TV Show
7	Sankofa	United States	Movie
7	Sankofa	Ghana	Movie
...
8801	Zinzana	Jordan	Movie
8802	Zodiac	United States	Movie
8804	Zombieland	United States	Movie
8805	Zoom	United States	Movie
8806	Zubaan	India	Movie

10014 rows × 3 columns

In [428...]

```
tcy[tcy['type']=='Movie']['country'].value_counts()
```



```
Out[428]: United States      2751
          India            962
          United Kingdom   532
          Canada           319
          France           303
          ...
          Bermuda          1
          Angola           1
          Armenia          1
          Mongolia         1
          Montenegro       1
          Name: country, Length: 122, dtype: int64
```

```
In [429... tcy[tcy['type']=='Movie']['country'].value_counts().sum()
```

```
Out[429]: 7374
```

```
In [430... tcy[tcy['type']=='TV Show']['country'].value_counts()
```

```
Out[430]: United States      938
          United Kingdom   272
          Japan            199
          South Korea      170
          Canada           126
          ...
          Malta            1
          Belarus          1
          United Arab Emirates 1
          Uruguay          1
          Switzerland      1
          Name: country, Length: 66, dtype: int64
```

```
In [431... tcy[tcy['type']=='TV Show']['country'].value_counts().sum()
```

```
Out[431]: 2640
```

```
In [432... tcy[tcy['type']=='Movie']['country'].value_counts().sum()
```

```
Out[432]: 7374
```

```
In [433... tcy[tcy['type']=='Movie']['country'].nunique()
```

```
Out[433]: 122
```

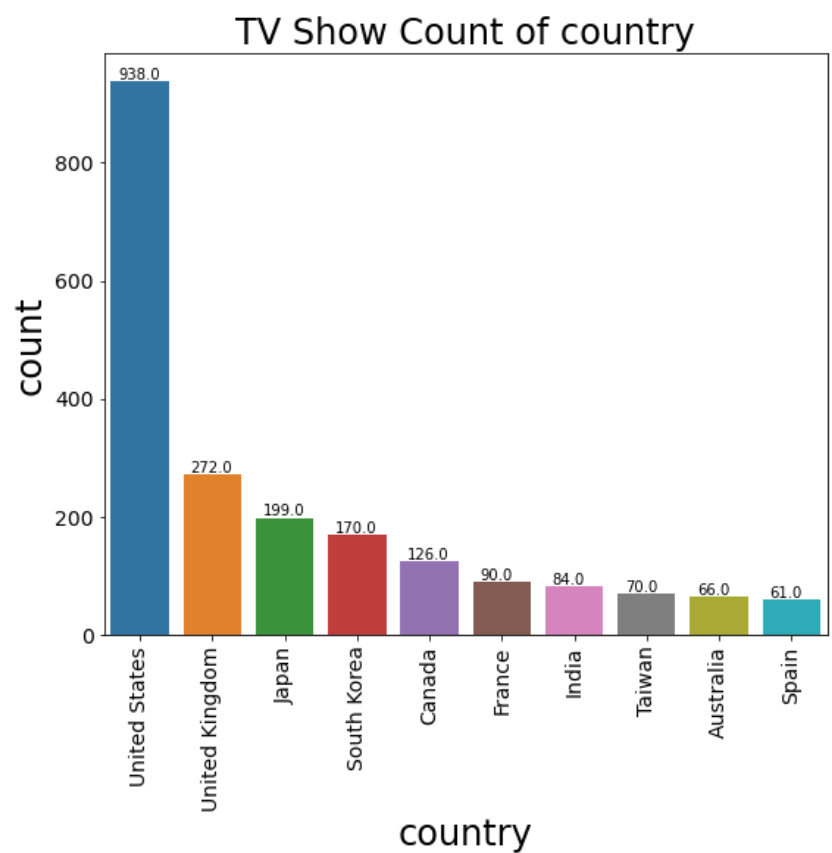
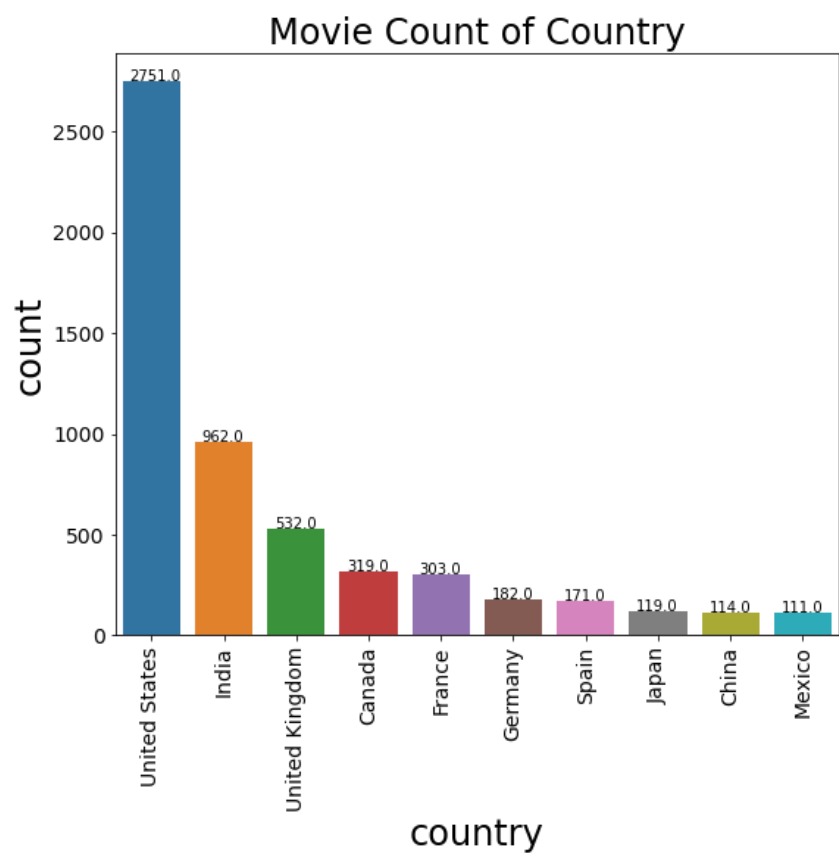
```
In [434... tcy[tcy['type']=='TV Show']['country'].nunique()
```

```
Out[434]: 66
```

Bi- Variate Analysis

```
In [435... plt.figure(figsize=(30,16))
plt.subplot(2, 3, 1)

plt.xlabel("country")
plt.ylabel(" Movie count")
plt.xticks(rotation=90,fontsize=14)
plt.yticks(fontsize=14)
plt.xlabel('country',size=24)
plt.ylabel('Count',size=24)
plt.title("Movie Count of Country", fontsize=24);
a=sns.countplot(x="country", data=tcy[tcy["type"]=="Movie"], order=tcy[tcy['type']=='Movie']['country'].value_counts().
for p in a.patches:
    a.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.10, p.get_height()+0.45))
plt.subplot(2, 3, 2)
plt.xlabel("country")
plt.ylabel("TV Show")
plt.xlabel('country',size=24)
plt.ylabel('Count',size=24)
plt.xticks(rotation=90,fontsize=14)
plt.yticks(fontsize=14)
plt.title("TV Show Count of country",fontsize=24);
b=sns.countplot(x="country", data=tcy[tcy["type"]=="TV Show"], order=tcy[tcy['type']=='TV Show']['country'].value_count
for p in b.patches:
    b.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.10, p.get_height()+2.95))
plt.show()
```



Comment- The highest number of Movies and TV Show in Netflix are from 'United States' country.

Unnesting of Title, Listed_in and Type

In [438...

```
tli1=df[["title","listed_in","type"]]
tli1["listed_in"]=tli1["listed_in"].str.split(", ")
tli=tli1.explode("listed_in")
tli.replace("nan",
            np.nan, inplace=True)
tli.dropna(inplace=True)
tli
```

C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\2181864249.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy

```
tli1["listed_in"]=tli1["listed_in"].str.split(", ")
```

Out[438]:

	title	listed_in	type
0	Dick Johnson Is Dead	Documentaries	Movie
1	Blood & Water	International TV Shows	TV Show
1	Blood & Water	TV Dramas	TV Show
1	Blood & Water	TV Mysteries	TV Show
2	Ganglands	Crime TV Shows	TV Show
...
8805	Zoom	Children & Family Movies	Movie
8805	Zoom	Comedies	Movie
8806	Zubaan	Dramas	Movie
8806	Zubaan	International Movies	Movie
8806	Zubaan	Music & Musicals	Movie

19323 rows × 3 columns

In [439...

```
tli[tli['type']=='Movie']['listed_in'].value_counts()
```

```
Out[439]: International Movies      2752
          Dramas                  2427
          Comedies                 1674
          Documentaries            869
          Action & Adventure        859
          Independent Movies        756
          Children & Family Movies  641
          Romantic Movies           616
          Thrillers                 577
          Music & Musicals          375
          Horror Movies             357
          Stand-Up Comedy           343
          Sci-Fi & Fantasy           243
          Sports Movies             219
          Classic Movies            116
          LGBTQ Movies              102
          Anime Features            71
          Cult Movies               71
          Faith & Spirituality       65
          Movies                    57
          Name: listed_in, dtype: int64
```

```
In [440... tli[tli['type']=='Movie']['listed_in'].value_counts().sum()
```

```
Out[440]: 13190
```

```
In [442... tli[tli['type']=='Movie']['listed_in'].unique()
```

```
Out[442]: array(['Documentaries', 'Children & Family Movies', 'Dramas',
          'Independent Movies', 'International Movies', 'Comedies',
          'Thrillers', 'Romantic Movies', 'Music & Musicals',
          'Horror Movies', 'Sci-Fi & Fantasy', 'Action & Adventure',
          'Classic Movies', 'Anime Features', 'Sports Movies', 'Cult Movies',
          'Faith & Spirituality', 'LGBTQ Movies', 'Stand-Up Comedy',
          'Movies'], dtype=object)
```

```
In [444... tli[tli['type']=='Movie']['listed_in'].nunique()
```

```
Out[444]: 20
```

```
In [443... tli[tli['type']=='TV Show']['listed_in'].value_counts()
```

```
Out[443]: International TV Shows      1351
          TV Dramas                   763
          TV Comedies                 581
          Crime TV Shows              470
          Kids' TV                    451
          Docuseries                  395
          Romantic TV Shows           370
          Reality TV                  255
          British TV Shows            253
          Anime Series                176
          Spanish-Language TV Shows  174
          TV Action & Adventure        168
          Korean TV Shows             151
          TV Mysteries                98
          Science & Nature TV          92
          TV Sci-Fi & Fantasy           84
          TV Horror                   75
          Teen TV Shows               69
          TV Thrillers                57
          Stand-Up Comedy & Talk Shows 56
          Classic & Cult TV            28
          TV Shows                    16
          Name: listed_in, dtype: int64
```

```
In [445... tli[tli['type']=='TV Show']['listed_in'].value_counts().sum()
```

```
Out[445]: 6133
```

```
In [446... tli[tli['type']=='TV Show']['listed_in'].unique()
```

```
Out[446]: array(['International TV Shows', 'TV Dramas', 'TV Mysteries',
          'Crime TV Shows', 'TV Action & Adventure', 'Docuseries',
          'Reality TV', 'Romantic TV Shows', 'TV Comedies', 'TV Horror',
          'British TV Shows', 'Spanish-Language TV Shows', 'TV Thrillers',
          "Kids' TV", 'TV Sci-Fi & Fantasy', 'Anime Series',
          'Korean TV Shows', 'Science & Nature TV', 'Teen TV Shows',
          'TV Shows', 'Stand-Up Comedy & Talk Shows', 'Classic & Cult TV'],
          dtype=object)
```

```
In [447... tli[tli['type']=='TV Show']['listed_in'].nunique()
```

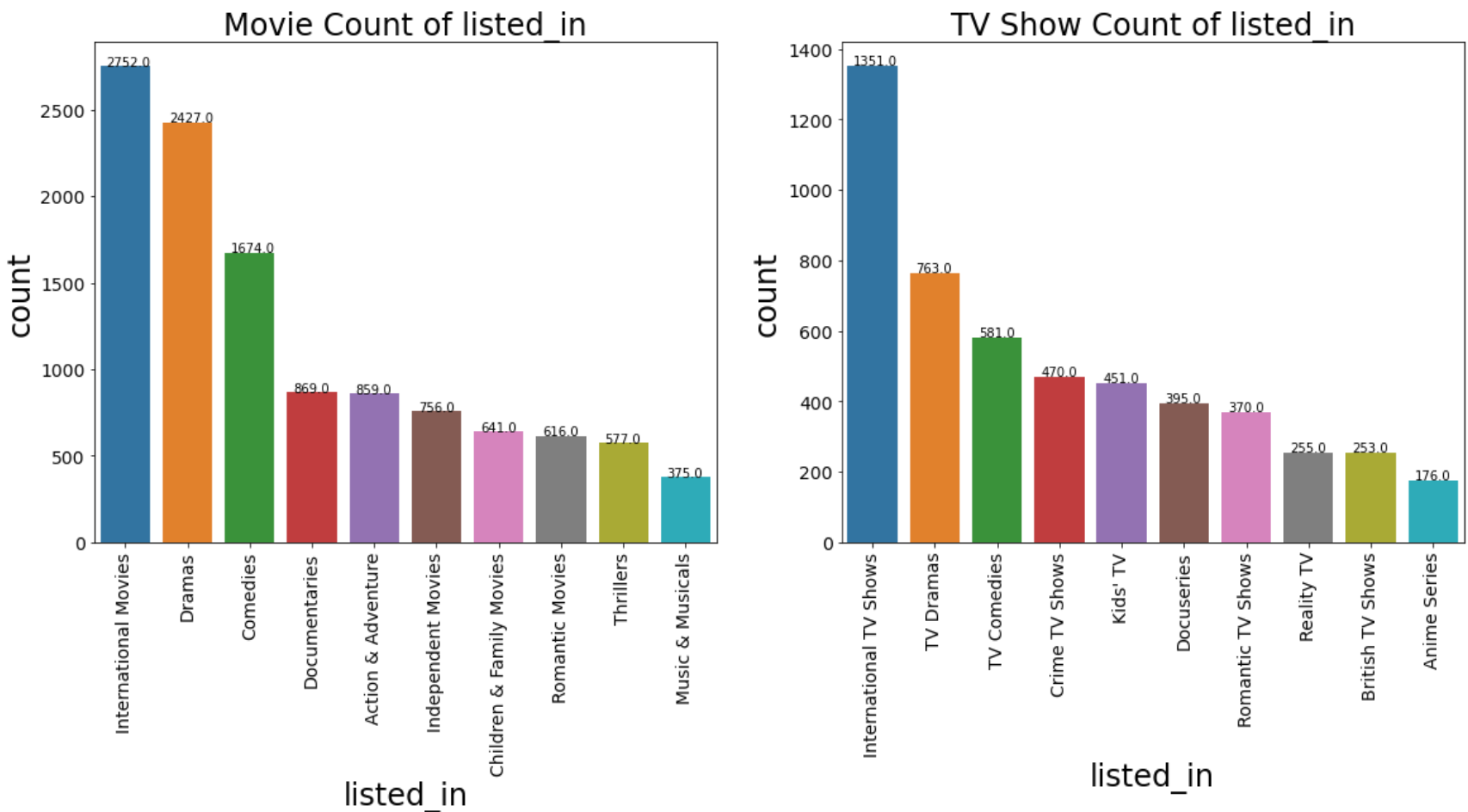
```
Out[447]: 22
```

Bi- Variate Analysis

```
In [460... plt.figure(figsize=(30,16))
plt.subplot(2, 3, 1)

plt.xlabel("listed_in")
plt.ylabel(" Movie count")
```

```
plt.xticks(rotation=90,fontsize=14)
plt.yticks(fontsize=14)
plt.xlabel('listed_in',size=24)
plt.ylabel('Count',size=24)
plt.title("Movie Count of listed_in", fontsize=24);
a=sns.countplot(x="listed_in", data=tli[tli["type"]=="Movie"], order=tli[tli['type']=='Movie']['listed_in'].value_count
for p in a.patches:
    a.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.10, p.get_height()+0.45))
plt.subplot(2, 3, 2)
plt.xlabel("listed_in")
plt.ylabel("TV Show")
plt.xlabel('listed_in',size=24)
plt.ylabel('Count',size=24)
plt.xticks(rotation=90,fontsize=14)
plt.yticks(fontsize=14)
plt.title("TV Show Count of listed_in",fontsize=24);
b=sns.countplot(x="listed_in", data=tli[tli["type"]=="TV Show"], order=tli[tli['type']=='TV Show']['listed_in'].value_c
for p in b.patches:
    b.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.10, p.get_height()+2.95))
plt.show()
```



Comment- The highest number of movies and TV shows are listed under International Movies and International TV shows genre.

In [449]...

```
tr1=df[["title","rating","type"]]
tr1["rating"]=tr1["rating"].str.split(", ")
tr=tr1.explode("rating")
tr.replace("nan",
           np.nan, inplace=True)
tr.dropna(inplace=True)
tr

C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\43719155.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy
tr1["rating"]=tr1["rating"].str.split(", ")
```

Out[449]:

	title	rating	type
0	Dick Johnson Is Dead	PG-13	Movie
1	Blood & Water	TV-MA	TV Show
2	Ganglands	TV-MA	TV Show
3	Jailbirds New Orleans	TV-MA	TV Show
4	Kota Factory	TV-MA	TV Show
...
8802	Zodiac	R	Movie
8803	Zombie Dumb	TV-Y7	TV Show
8804	Zombieland	R	Movie
8805	Zoom	PG	Movie
8806	Zubaan	TV-14	Movie

8803 rows × 3 columns

```
In [451... tr[tr['type']=='Movie']['rating'].value_counts()

Out[451]: TV-MA      2062
TV-14      1427
R           797
TV-PG      540
PG-13      490
PG          287
TV-Y7      139
TV-Y        131
TV-G        126
NR           75
G           41
TV-Y7-FV     5
NC-17        3
UR           3
74 min       1
84 min       1
66 min       1
Name: rating, dtype: int64

In [452... tr[tr['type']=='Movie']['rating'].value_counts().sum()

Out[452]: 6129

In [455... tr[tr['type']=='Movie']['rating'].unique()

Out[455]: array(['PG-13', 'PG', 'TV-MA', 'TV-PG', 'TV-14', 'TV-Y', 'R', 'TV-G',
      'TV-Y7', 'G', 'NC-17', '74 min', '84 min', '66 min', 'NR',
      'TV-Y7-FV', 'UR'], dtype=object)

In [456... tr[tr['type']=='Movie']['rating'].nunique()

Out[456]: 17

In [453... tr[tr['type']=='TV Show']['rating'].value_counts()

Out[453]: TV-MA      1145
TV-14      733
TV-PG      323
TV-Y7      195
TV-Y        176
TV-G         94
NR           5
R             2
TV-Y7-FV     1
Name: rating, dtype: int64

In [454... tr[tr['type']=='TV Show']['rating'].value_counts().sum()

Out[454]: 2674

In [457... tr[tr['type']=='TV Show']['rating'].unique()

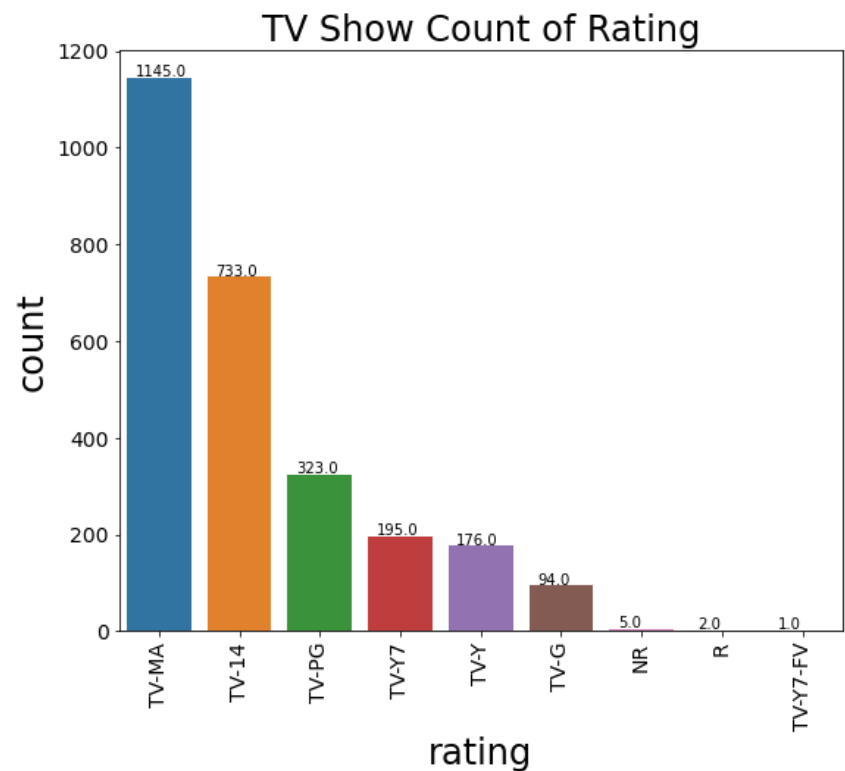
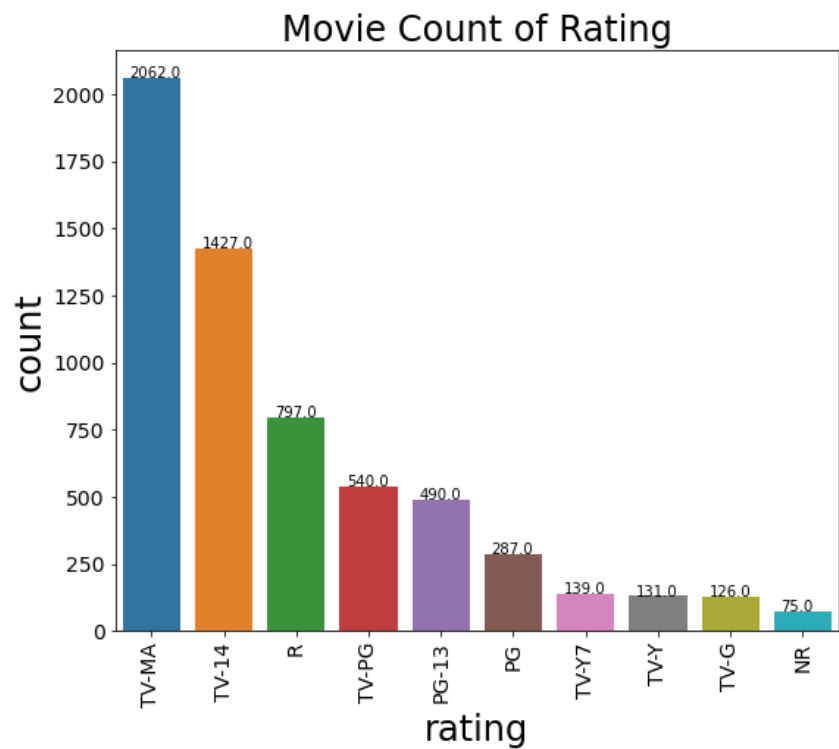
Out[457]: array(['TV-MA', 'TV-14', 'TV-Y7', 'TV-PG', 'TV-Y', 'TV-G', 'R', 'NR',
      'TV-Y7-FV'], dtype=object)

In [458... tr[tr['type']=='TV Show']['rating'].nunique()

Out[458]: 9

In [462... plt.figure(figsize=(30,16))
plt.subplot(2, 3, 1)

plt.xlabel("Rating")
plt.ylabel(" Movie count")
plt.xticks(rotation=90,fontsize=14)
plt.yticks(fontsize=14)
plt.xlabel('Rating',size=24)
plt.ylabel('Count',size=24)
plt.title("Movie Count of Rating", fontsize=24);
a=sns.countplot(x="rating", data=tr[tr["type"]=="Movie"], order=tr[tr['type']=='Movie']['rating'].value_counts().index)
for p in a.patches:
    a.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.10, p.get_height()+0.45))
plt.subplot(2, 3, 2)
plt.xlabel("rating")
plt.ylabel("TV Show")
plt.xlabel('Rating',size=24)
plt.ylabel('Count',size=24)
plt.xticks(rotation=90,fontsize=14)
plt.yticks(fontsize=14)
plt.title("TV Show Count of Rating",fontsize=24);
b=sns.countplot(x="rating", data=tr[tr["type"]=="TV Show"], order=tr[tr['type']=='TV Show']['rating'].value_counts().index)
for p in b.patches:
    b.annotate('{:.1f}'.format(p.get_height()), (p.get_x()+0.10, p.get_height()+2.95))
plt.show()
```



Comment- The highest number of rating for movies and TV show is 'TV-MA'.

Unnesting of Title, release_year and Type

```
In [467... tryy1=df[["title","release_year","type"]]
tryy=tryy1.explode("release_year")
tryy.replace("nan",
             np.nan, inplace=True)
tryy.dropna(inplace=True)
tryy
```

Out[467]:

	title	release_year	type
0	Dick Johnson Is Dead	2020	Movie
1	Blood & Water	2021	TV Show
2	Ganglands	2021	TV Show
3	Jailbirds New Orleans	2021	TV Show
4	Kota Factory	2021	TV Show
...
8802	Zodiac	2007	Movie
8803	Zombie Dumb	2018	TV Show
8804	Zombieland	2009	Movie
8805	Zoom	2006	Movie
8806	Zubaan	2015	Movie

8807 rows × 3 columns

```
In [502... tryy[tryy['type']=='Movie']['release_year'].value_counts()
```

Out[502]:

2017	767
2018	767
2016	658
2019	633
2020	517
...	
1966	1
1961	1
1946	1
1963	1
1947	1

Name: release_year, Length: 73, dtype: int64

```
In [473... tryy[tryy['type']=='Movie']['release_year'].unique()
```

Out[473]:

```
array([2020, 2021, 1993, 1996, 1998, 1997, 2010, 2013, 2017, 1975, 1978,
       1983, 1987, 2012, 2001, 2002, 2003, 2004, 2011, 2008, 2009, 2007,
       2005, 2006, 2018, 2019, 1994, 2015, 1982, 1989, 2014, 1990, 1991,
       1999, 2016, 1986, 1984, 1980, 1961, 2000, 1995, 1985, 1992, 1976,
       1959, 1988, 1981, 1972, 1964, 1954, 1979, 1958, 1956, 1963, 1970,
       1973, 1960, 1974, 1966, 1971, 1962, 1969, 1977, 1967, 1968, 1965,
       1945, 1946, 1942, 1955, 1944, 1947, 1943], dtype=int64)
```

```
In [474... tryy[tryy['type']=='Movie']['release_year'].nunique()
```

Out[474]:

73

```
In [470... tryy[tryy['type']=='Movie']['release_year'].value_counts().sum()
```

Out[470]: 6131

In [471... tryy[tryy['type']=='TV Show']['release_year'].value_counts()

Out[471]: 2020 436
2019 397
2018 380
2021 315
2017 265
2016 244
2015 162
2014 88
2012 64
2013 63
2010 40
2011 40
2009 34
2008 23
2006 14
2007 14
2005 13
2003 10
2004 9
1999 7
2002 7
2001 5
1993 4
2000 4
1997 4
1998 4
1990 3
1996 3
1992 3
1995 2
1994 2
1988 2
1986 2
1989 1
1967 1
1985 1
1946 1
1981 1
1972 1
1979 1
1977 1
1991 1
1974 1
1925 1
1945 1
1963 1
Name: release_year, dtype: int64

In [472... tryy[tryy['type']=='TV Show']['release_year'].value_counts().sum()

Out[472]: 2676

In [475... tryy[tryy['type']=='TV Show']['release_year'].unique()

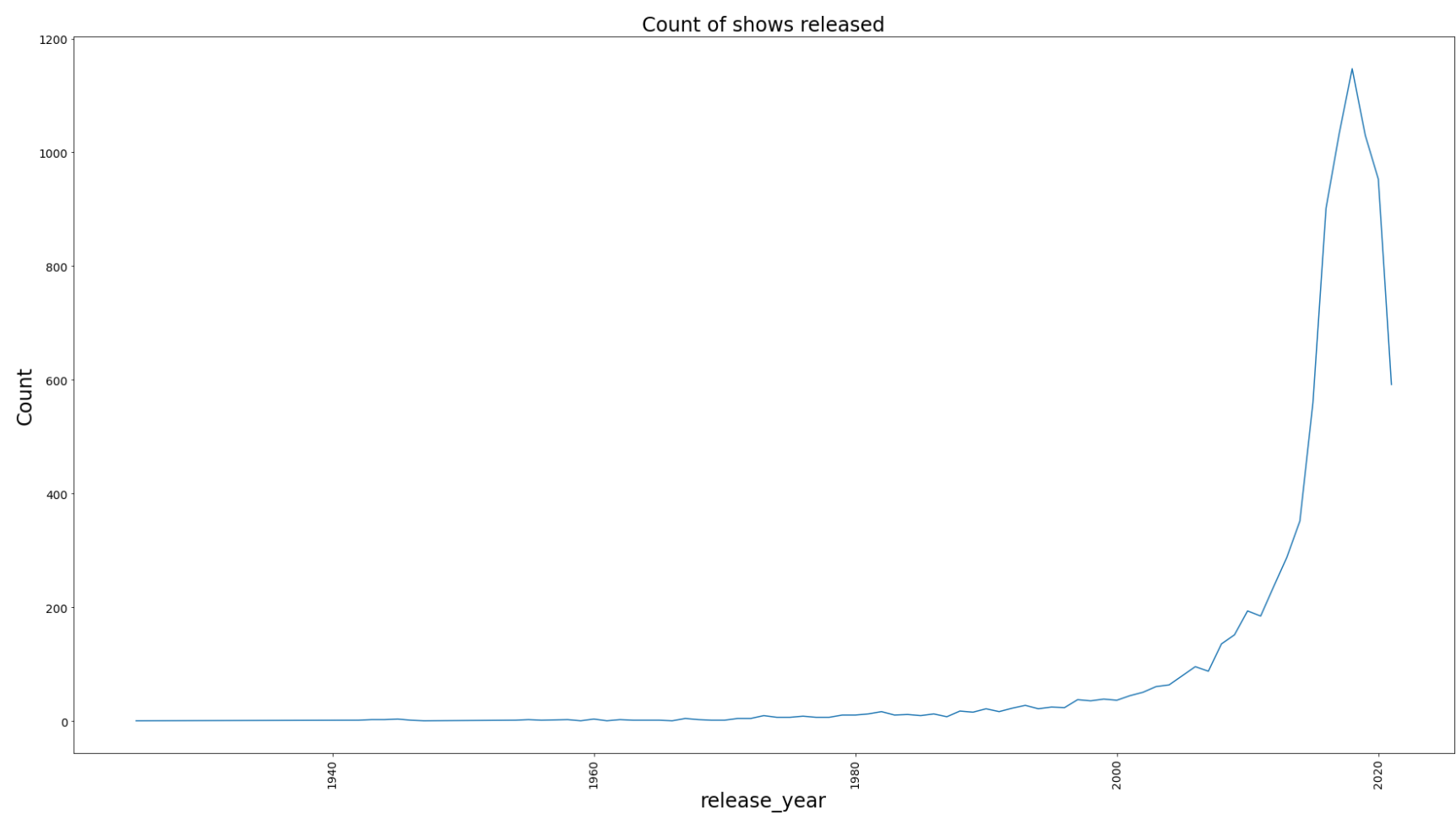
Out[475]: array([2021, 2020, 2018, 2014, 1994, 2015, 2013, 2019, 2017, 2016, 2012, 1992, 2002, 2009, 2011, 2005, 2008, 2010, 2007, 2001, 2006, 1993, 1997, 2003, 1945, 1999, 1998, 2000, 2004, 1986, 1995, 1925, 1972, 1974, 1988, 1991, 1977, 1979, 1990, 1996, 1981, 1946, 1985, 1967, 1989, 1963], dtype=int64)

In [476... tryy[tryy['type']=='TV Show']['release_year'].nunique()

Out[476]: 46

Uni-variate Analysis

In [501... plt.figure(figsize=(30,16))
tryyy=df.groupby(df["release_year"])[["show_id"]].count().sort_values(by=["show_id"],ascending=False).reset_index()
plt.title("Count of shows released", size=24)
plt.xticks(rotation=90,fontsize=14)
plt.yticks(fontsize=14)
plt.xlabel('release_year',size=24)
plt.ylabel('Count',size=24)
a=sns.lineplot(data=tryyy, x=tryyy["release_year"], y=tryyy["show_id"])



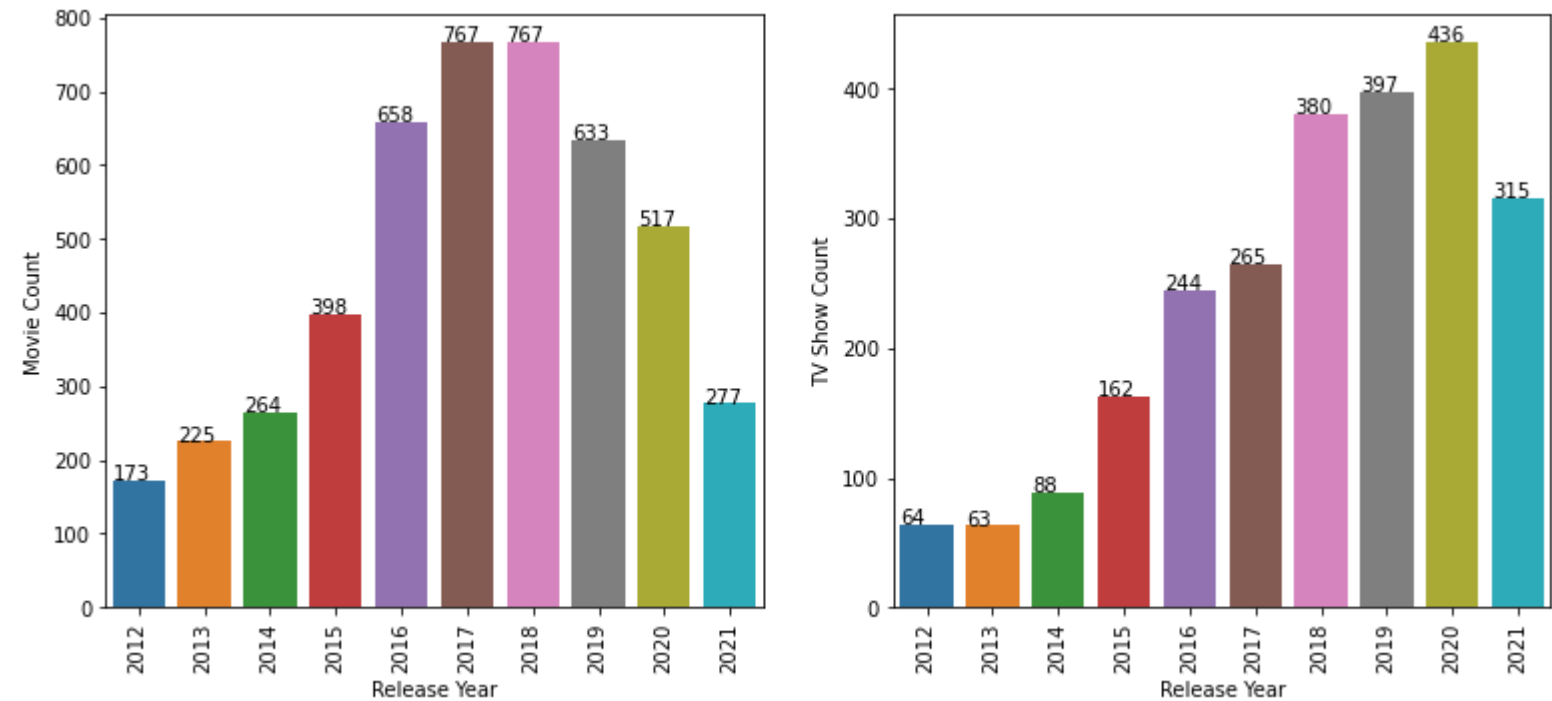
Comment- The highest number of shows have been released on 2020 year.

Bi- Variate Analysis

In [515...

```
plt.figure(figsize=(20,12))
plt.subplot(2, 3, 1)
a=sns.barplot(data=tryy, x=tryy[tryy["type"]=="Movie"]['release_year'].value_counts().index[0:10],
y=tryy[tryy["type"]=="Movie"]['release_year'].value_counts().head(10))
plt.xticks(rotation=90)
plt.xlabel("Release Year")
plt.ylabel("Movie Count")
for p in a.patches:
    a.annotate('{:.0f}'.format(p.get_height()), (p.get_x()+0.00, p.get_height()+0.55))

plt.subplot(2, 3, 2)
b=sns.barplot(data=tryy, x=tryy[tryy["type"]=="TV Show"]['release_year'].value_counts().index[0:10],
y=tryy[tryy["type"]=="TV Show"]['release_year'].value_counts().head(10))
plt.xticks(rotation=90)
plt.xlabel("Release Year")
plt.ylabel("TV Show Count")
for p in b.patches:
    b.annotate('{:.0f}'.format(p.get_height()), (p.get_x()+0.00, p.get_height()+0.55))
```



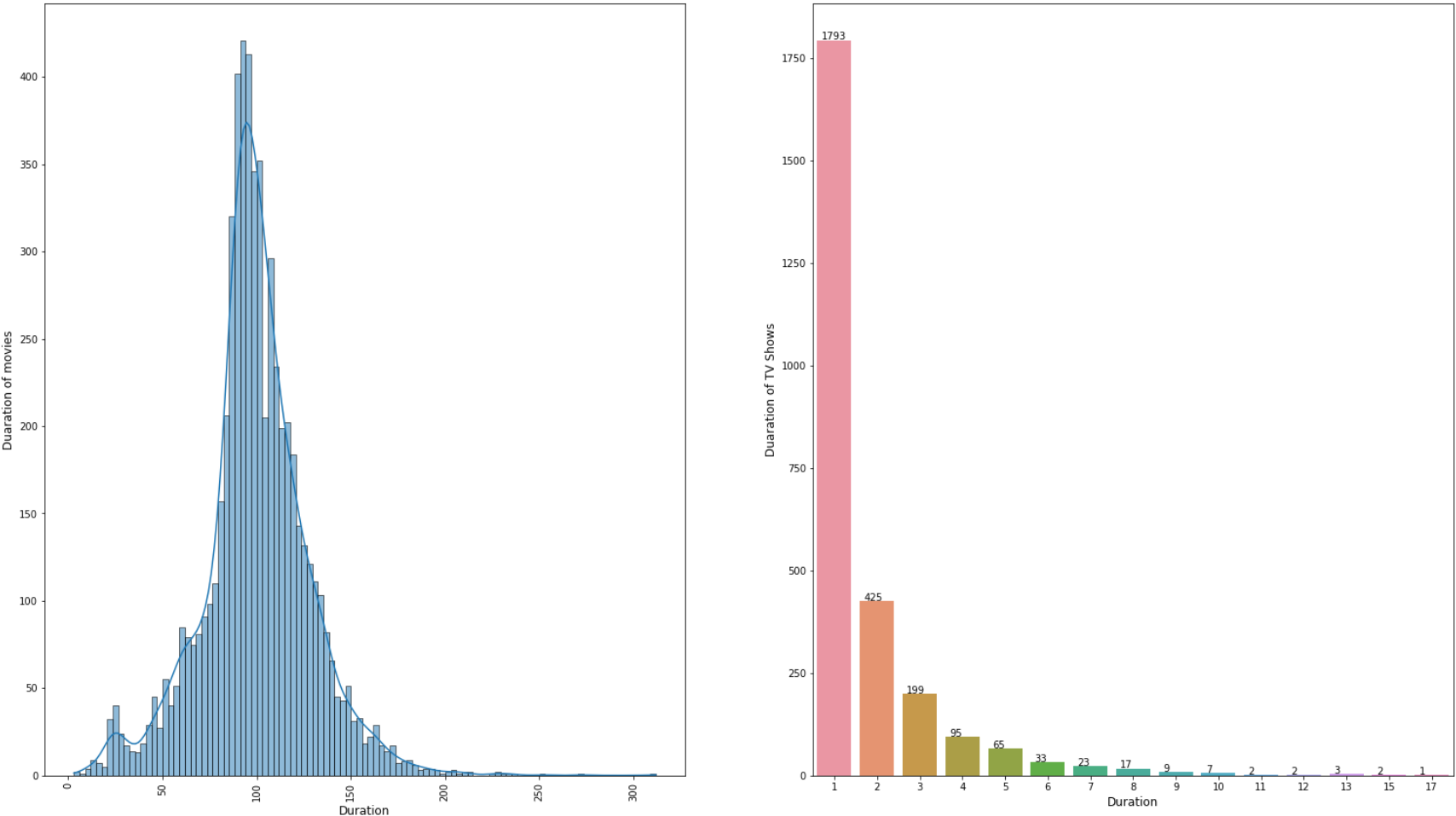
Comment- Highest number of movies have been released on 2017 and 2018 year wheres highest number of Tv shows are released on 2020 year.

In [526...

```
plt.figure(figsize=(40,32))
plt.subplot(2, 3, 1)
sns.histplot(df[df['type']=='Movie']['duration'],kde = True)
plt.xlabel("Duration", fontsize=12)
plt.ylabel("DuARATION of movies", fontsize=12)
plt.xticks(rotation=90)
plt.subplot(2, 3, 2)
a=sns.countplot(df[df['type']=='TV Show']['duration'],x = 'duration')
plt.xlabel("Duration", fontsize=12)
plt.ylabel("DuARATION of TV Shows", fontsize=12)
for p in a.patches:
    a.annotate('{:.0f}'.format(p.get_height()), (p.get_x()+0.10, p.get_height()+0.85))
```


C:\Users\Sadiq\anaconda3\lib\site-packages\seaborn_decorators.py:36: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

```
warnings.warn(
```



Comment- The highest number of minutes, users spent over netflix movies varies from 80 to 120 minutes and season 1 TV show has the highest spent duration.

In [553...

```
tcy1=df[["type","title","country","duration"]]  
tcy1["country"]=tcy1["country"].str.split(", ")  
tcy1=tcy1.explode("country")  
cat = tli["listed_in"].value_counts().index[0:5]  
tle1 = tli['title'].value_counts().index[0:5]  
cny = tcy1['country'].value_counts().index[0:5]  
typ = tcy1['type'].value_counts().index[0:2]  
typ_data = tcy1.loc[(tcy1['country'].isin(cny)) & (tcy1['type'].isin(typ)) & (tcy1['type'].isin(typ))]  
typ_data
```

C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\2554661986.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy

```
tcy1["country"]=tcy1["country"].str.split(", ")
```

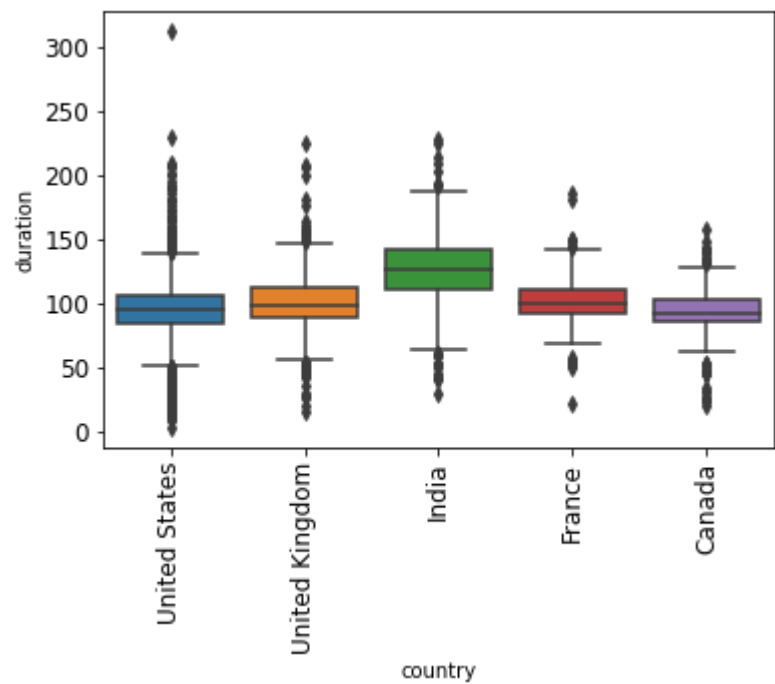
Out[553]:

	type	title	country	duration
0	Movie	Dick Johnson Is Dead	United States	90
4	TV Show	Kota Factory	India	2
7	Movie	Sankofa	United States	125
7	Movie	Sankofa	United Kingdom	125
8	TV Show	The Great British Baking Show	United Kingdom	9
...
8799	Movie	Zenda	India	120
8802	Movie	Zodiac	United States	158
8804	Movie	Zombieland	United States	88
8805	Movie	Zoom	United States	88
8806	Movie	Zubaan	India	111

6377 rows × 4 columns

In [554...

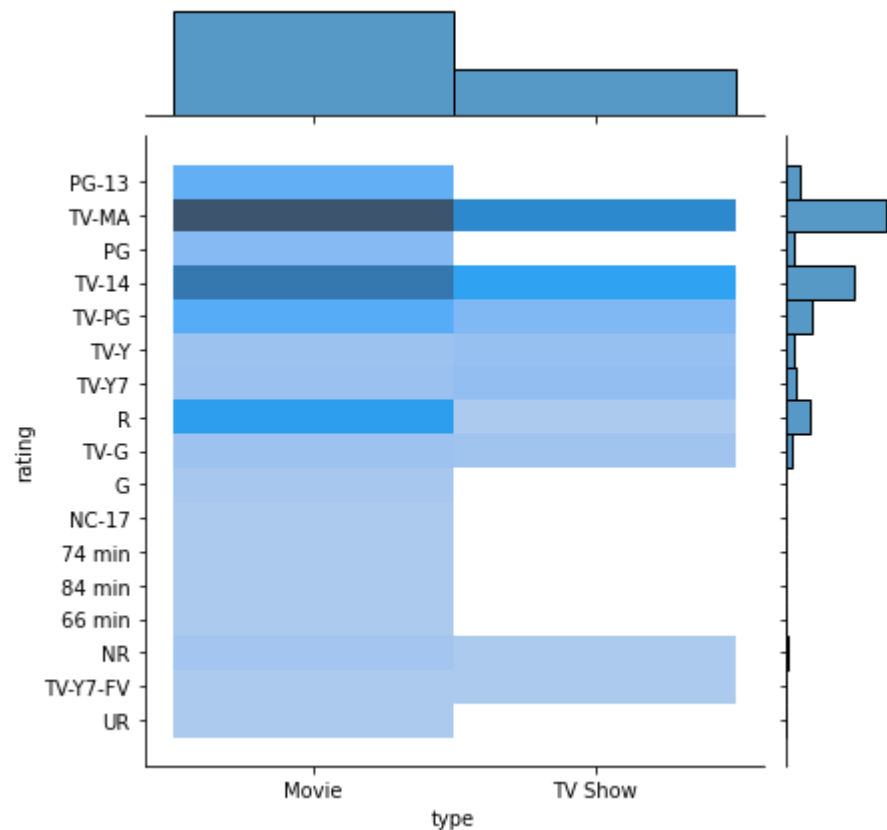
```
sns.boxplot(x='country', y='duration', data=typ_data[typ_data["type"]=="Movie"])  
plt.xticks(rotation=90,fontsize=12)  
plt.yticks(fontsize=12)  
plt.show()
```



Comment- Indian users spent highest duration of time watching Movies at Netflix.

In [528...

```
sns.jointplot(data=df, x="type", y="rating",kind="hist")
plt.show()
```



In [563...

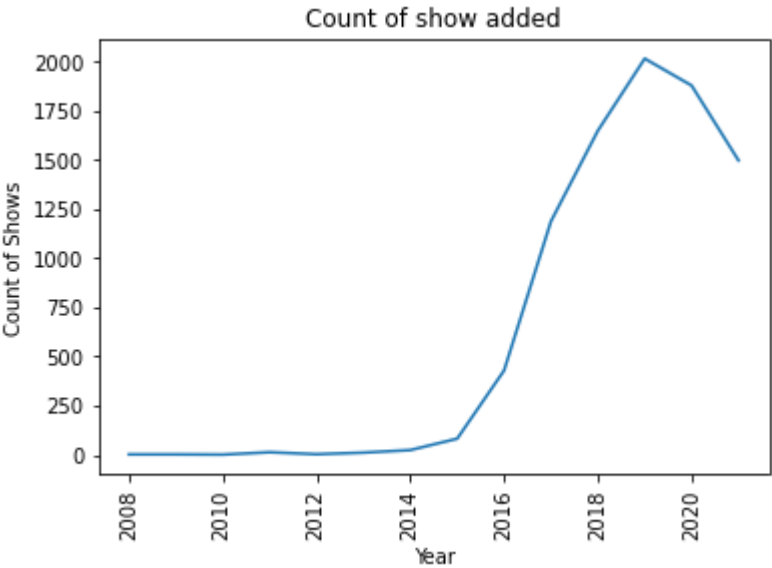
```
df['date_added'] = pd.to_datetime(df["date_added"])
df['year'] = df['date_added'].dt.year
df['month'] = df['date_added'].dt.month
df['week']=df['date_added'].dt.isocalendar().week
df.head()
```

Out[563]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	duration	listed_in	description	year	mo
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	2021-09-25	2020	PG-13	90	Documentaries	As her father nears the end of his life, filmm...	2021	
1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...	South Africa	2021-09-24	2021	TV-MA	2	International TV Shows, TV Dramas, TV Mysteries	After crossing paths at a party, a Cape Town t...	2021	
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...	NaN	2021-09-24	2021	TV-MA	1	Crime TV Shows, International TV Shows, TV Act...	To protect his family from a powerful drug lor...	2021	
3	s4	TV Show	Jailbirds New Orleans	NaN	NaN	NaN	2021-09-24	2021	TV-MA	1	Docuseries, Reality TV	Feuds, flirtations and toilet talk go down amo...	2021	
4	s5	TV Show	Kota Factory	NaN	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K...	India	2021-09-24	2021	TV-MA	2	International TV Shows, Romantic TV Shows, TV ...	In a city of coaching centers known to train l...	2021	

In [540...

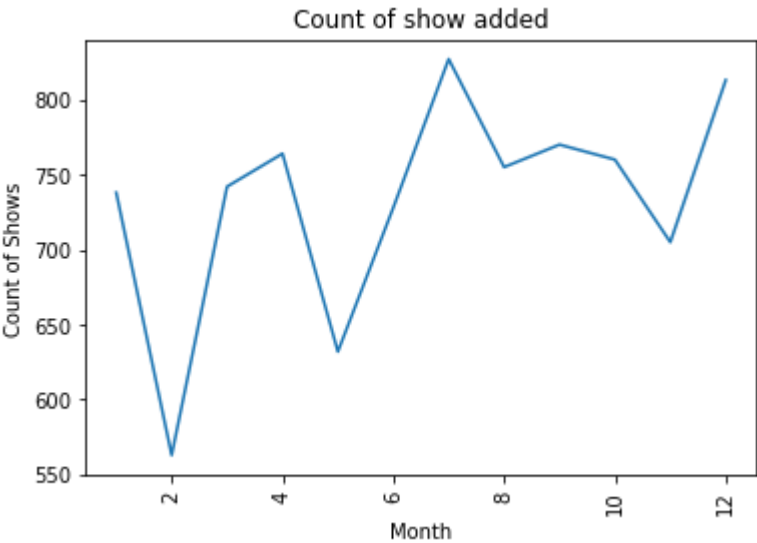
```
yr=df.groupby(df["year"])[["show_id"]].count().sort_values(by=["show_id"],ascending=False).reset_index()
plt.xticks(rotation=90)
plt.xlabel("Year")
plt.ylabel("Count of Shows")
plt.title("Count of show added")
a=sns.lineplot(data=yr, x=yr["year"], y=yr["show_id"])
```



Comment- In the 2020, highest number of movies and TV shows have been added on Netflix.

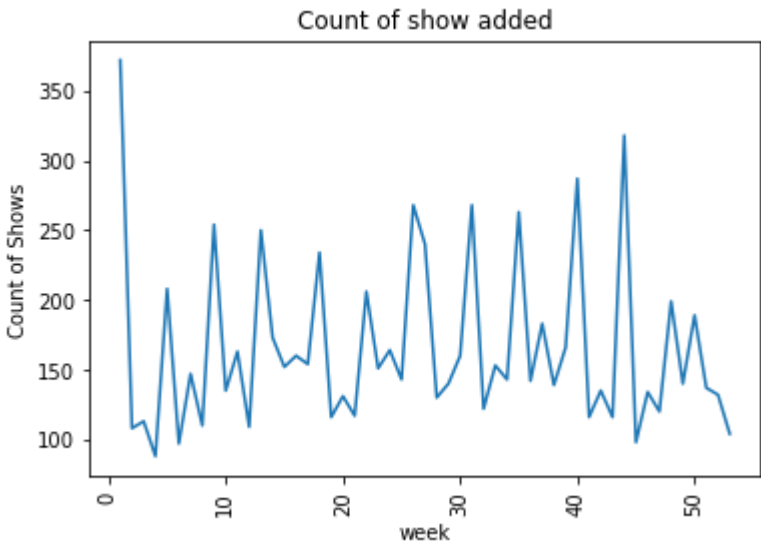
In [541...

```
mn=df.groupby(df["month"])[["show_id"]].count().sort_values(by=["show_id"],ascending=False).reset_index()
plt.xticks(rotation=90)
plt.xlabel("Month")
plt.ylabel("Count of Shows")
plt.title("Count of show added")
a=sns.lineplot(data=mn, x=mn["month"], y=mn["show_id"])
```



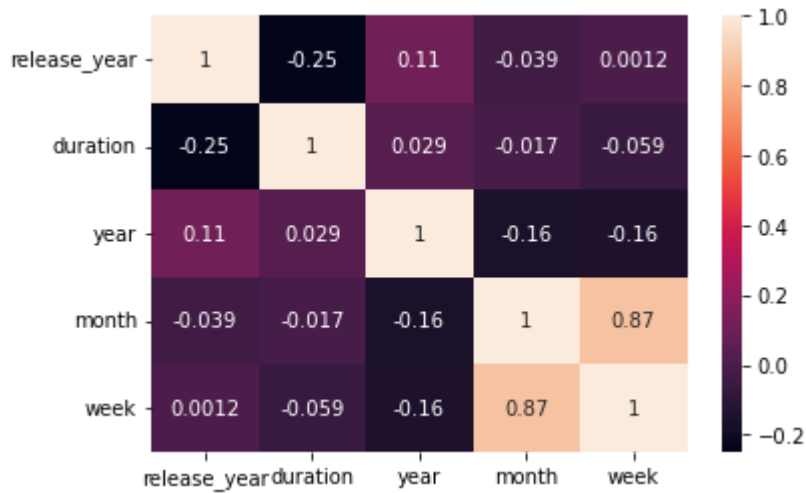
Comment- In July month, highest number of movies or TV shows have been added on Netflix.

```
In [543... wk=df.groupby(df["week"])[["show_id"]].count().sort_values(by=["show_id"],ascending=False).reset_index()
plt.xticks(rotation=90)
plt.xlabel("week")
plt.ylabel("Count of Shows")
plt.title("Count of show added")
a=sns.lineplot(data=wk, x=wk["week"], y=wk["show_id"])
```



```
In [561... corr = df.corr()
sns.heatmap(corr, annot=True)
```

Out[561]: <AxesSubplot:>



Comment- The month and week columns have the correlation

5. Missing Value & Outlier check (Treatment optional)

```
In [558... # Filling the missing value in date_added column
df['date_added'] = df['date_added'].fillna(df['date_added'].max())
```

```
In [560... # Filling the missing value in rating column
df['rating'] = df['rating'].fillna(df['rating'].mode()[0])
```

```
In [564... df.isna().sum()
```

Out[564]: show_id 0
type 0
title 0
director 2634
cast 825
country 831
date_added 0
release_year 0
rating 0
duration 0
listed_in 0
description 0
year 0
month 0
week 0
dtype: int64

```
In [567... # Filling data of cast with director column
tc1=df[["title","cast","type"]]
tc1["cast"]=tc1["cast"].str.split(", ")
tc=tc1.explode("cast")
td1=df[["title","director","type"]]
td1["director"]=td1["director"].str.split(", ")
td=td1.explode("director")
tcd=pd.merge(tc,td, on="title",how="inner")
tcd.isna().sum()
```

```
C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\3764346636.py:3: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy
    tc1["cast"]=tc1["cast"].str.split(", ")
C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\3764346636.py:6: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy
    td1["director"]=td1["director"].str.split(", ")
```

```
Out[567]: title      0
cast      960
type_x     0
director  19013
type_y     0
dtype: int64
```

```
In [570... tcd1=tcd.groupby(['director'])['cast'].agg(pd.Series.mode).to_frame().reset_index().rename(columns={'cast':'actor_mod'})
tcd2=tcd.merge(tcd1,on='director',how='left')
tcd2=tcd2.fillna({'cast':tcd2.actor_mod}).drop('actor_mod',axis=1)
tcd2.isna().sum()
```

```
Out[570]: title      0
cast      352
type_x     0
director  19013
type_y     0
dtype: int64
```

```
In [571... #Filling the country value with rating column
tcr=df[["type","country","rating"]]
tcr["country"]=tcr["country"].str.split(",")
tcr1=tcr.explode("country")
tcr1.isna().sum()
```

```
C:\Users\Sadiq\AppData\Local\Temp\ipykernel_11692\1560121334.py:3: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
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-versus-a-copy
    tcr["country"]=tcr["country"].str.split(",")
```

```
Out[571]: type      0
country    831
rating     0
dtype: int64
```

```
In [576... tcr2=tcr.groupby(['rating',"type"])['country'].agg(pd.Series.mode).to_frame().reset_index().rename(columns={'country':'
tcr3=tcr1.merge(tcr2,on=['rating',"type"],how='left')
tcr3=tcr3.fillna({'country':tcr3.country_mod}).drop('country_mod',axis=1)
tcr3.isna().sum()
```

```
Out[576]: type      0
country    0
rating     0
dtype: int64
```

Comment- Missing values have been reduced after filling the values using mod imputation.

7. Business Insights

1. There are ‘36439’ different cast that have acted in ‘7982’ different Movies and Tv shows on Netflix. Among them, ‘Anupam Kher’ has acted in the highest number of movies and Tv show total, i.e. ‘43’.
2. There are ‘4993’ different directors who have directed for ‘6173’ different number of Movies and TV shows. Among them, ‘Rajiv Chilaka’ has directed the highest number of movies in total ‘22’.
3. Netflix has added ‘7976’ movies and Tv shows having their corresponding ‘127’ countries. Among them, the country ‘United states’ has the highest number of Movies and TV show with the count of ‘3689’.
4. The Netflix TV shows and movies have ‘42’ different genres. Among them, the ‘International Movies’ genre has the highest count of ‘2752’ movies and TV shows.
5. There are 13 different ratings for Netflix TV shows and Movies. Among them, the highest rating is ‘TV-MA’ with a total of ‘3207’.
6. The Netflix movies and TV shows have been released in 74 different years across different countries. Among them, In 2018, the highest number of Movies and TV shows have been released.
7. Out of ‘25951’ different cast, ‘Anupam Kher’ has acted in the highest number of movies with count of ‘42’. Out of ‘14863’ different cast, ‘Takahiro Sakurai ’ has acted in the highest number of TV Shows with count of ‘25’.
8. Out of ‘4777’ different directors, ‘Rajiv Chilaka’ has directed the highest number of movies with count of ‘22’. Out of ‘299’ different directors, ‘Alastair Fothergill’ and Ken Burns have directed the highest number of TV Shows with count of ‘3’.

9. The United States country is leading for having the highest number of movies i.e '2751' and highest number of TV shows i.e '938'.

10. As per trend the decrease in adding movies and TV shows have been observed after 2019. As per trend, July and December are the months where the highest number of TV shows and movies were added.

8. Recommendations

- As the largest number of users prefer to watch Tv shows having only 1 or 2 seasons. Creating new Tv shows having a single season could be beneficial.
- As Indian users have spent the highest duration on Netflix movies, it would be beneficial to launch new movies with good advertisements in India.
- As the highest count of TV shows and movies having an Adult rating, it would be beneficial to produce movies and TV shows which can be viewed by any age, as it would attract and include children as well.
- It would be beneficial to launch new movies and TV shows during the Holiday season such as December and January.
- To increase the duration of users on Netflix, more TV shows and movies have to be added.