In [1]:

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

In [2]:

df = pd.read_csv("C:/Users/91981/Desktop/Mansi/scaler/Python Visualisation/netflix.csv")

In [3]:

df.head()

Out[3]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	C
0	s 1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	September 25, 2021	2020	PG- 13	
1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA	ξ.
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	NaN	September 24, 2021	2021	TV- MA	
3	s4	TV Show	Jailbirds New Orleans	NaN	NaN	NaN	September 24, 2021	2021	TV- MA	

	show_id	type	title	director	cast	country	date_added	release_year	rating	С
4	s 5	TV Show	Kota Factory	NaN	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	September 24, 2021	2021	TV- MA	•

In [4]:

df.shape

Out[4]:

(8807, 12)

In [5]:

df.info()

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

```
In [6]:
```

```
df.columns
```

```
Out[6]:
```

In [7]:

```
type_counts = df['type'].value_counts()
type_counts
```

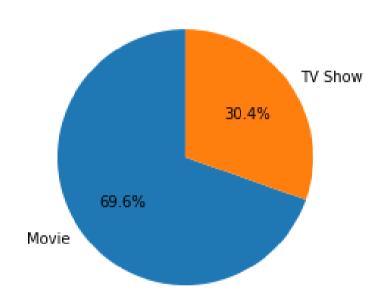
Out[7]:

Movie 6131 TV Show 2676

Name: type, dtype: int64

In [8]:

```
plt.pie(type_counts, labels= type_counts.index, autopct='%1.1f%%', startangle=90)
plt.show()
```



```
In [9]:
```

```
df.describe(include = 'all')
```

Out[9]:

	show_id	type	title	director	cast	country	date_added	release_year	rat
count	8807	8807	8807	6173	7982	7976	8797	8807.000000	8
unique	8807	2	8807	4528	7692	748	1767	NaN	
top	s1	Movie	Dick Johnson Is Dead	Rajiv Chilaka	David Attenborough	United States	January 1, 2020	NaN	
freq	1	6131	1	19	19	2818	109	NaN	3:
mean	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2014.180198	٨
std	NaN	NaN	NaN	NaN	NaN	NaN	NaN	8.819312	٨
min	NaN	NaN	NaN	NaN	NaN	NaN	NaN	1925.000000	٨
25%	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2013.000000	٨
50%	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2017.000000	٨
75%	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2019.000000	٨
max	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2021.000000	Ν

In [10]:

```
df['director'].value_counts()
```

Out[10]:

Rajiv Chilaka	19	
Raúl Campos, Jan Suter	18	
Marcus Raboy	16	
Suhas Kadav	16	
Jay Karas	14	
	• •	
Raymie Muzquiz, Stu Livingston	1	
Joe Menendez	1	
Eric Bross	1	
Will Eisenberg	1	
Mozez Singh	1	
Name: director, Length: 4528,	dtype:	int64

```
In [11]:
```

```
df['cast'].value_counts()
```

Out[11]:

```
David Attenborough
19
Yatsal Dubey, Julie Tejwani, Rupa Bhimani, Jigna Bhardwaj, Rajesh Kava, Mous
am, Swapnil
d#['country'].value counts()
Samuel West
00t[12]:
Jeff Dunham
                                             2818
⊎nited States
₱adia Spade, London Hughes, Fortune Feimste<sup>972</sup>
⊌nited Kingdom
                                              419
Japan
                                              245
South Korea
                                              199
Michael Peña, Diego Luna, Tenoch Huerta, Joaquin Cosio, José María Yazpik, M
Bemaniaschelganiass Hungary
∀ruguay, Guatemaĺa
Nierceachenegelatuchey
Mexico, United States, Spain, Colombia
ଏହା ବ୍ୟକ୍ତ, <sup>E</sup> ଅଞ୍ଚଳ ବ୍ୟଳ ଅନ୍ତର୍ମଣ ନୁ Haru, Kentaro Sakaguchi, Takayuki Yamada, Kendo
ฟือิซิติง่ล§คิษีทุ๋tหั≱ต Ұติริติข้อ; ⊼ีคลิtadtWP@tajnt@2uki Matsuo, Koichi Yamadera, Arata I
ura, Chikako Kaku, Kotaro Yoshida
Toyin Abraham, Sambasa Nzeribe, Chioma Chukwuka Akpotha, Chioma Omeruah, Chi
wetalu Agu, Dele Odule, Femi Adebayo, Bayray McNwizu, Biodun Stephen
1
Vicky Kaushal, Sarah-Jane Dias, Raaghav Chanana, Manish Chaudhary, Meghna Ma
lik, Malkeet Rauni, Anita Shabdish, Chittaranjan Tripathy
```

```
Name<sup>13</sup>dast, Length: 7692, dtype: int64
df['release_year'].value_counts()
Out[13]:
2018
         1147
2017
         1032
2019
         1030
2020
         953
2016
          902
1959
1925
            1
```

Name: release_year, Length: 74, dtype: int64

In [14]:

```
df['date_added'] = pd.to_datetime(df['date_added'])
df['DA_year'] = df['date_added'].dt.year
df['DA_month'] = df['date_added'].dt.month_name().str[:3]
```

In [15]:

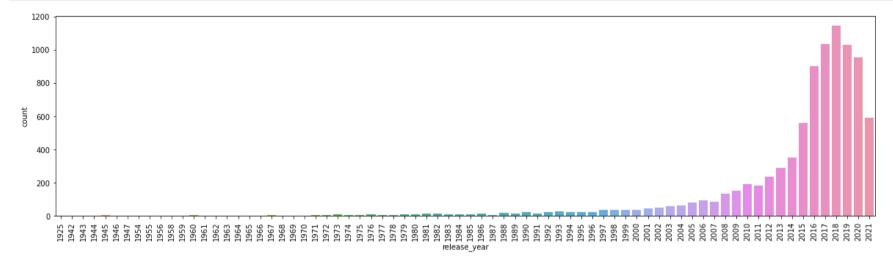
Univariate and Bivariate Ananlysis for unnested data alongwith missing value imoutation

In [16]:

Univariate Analysis

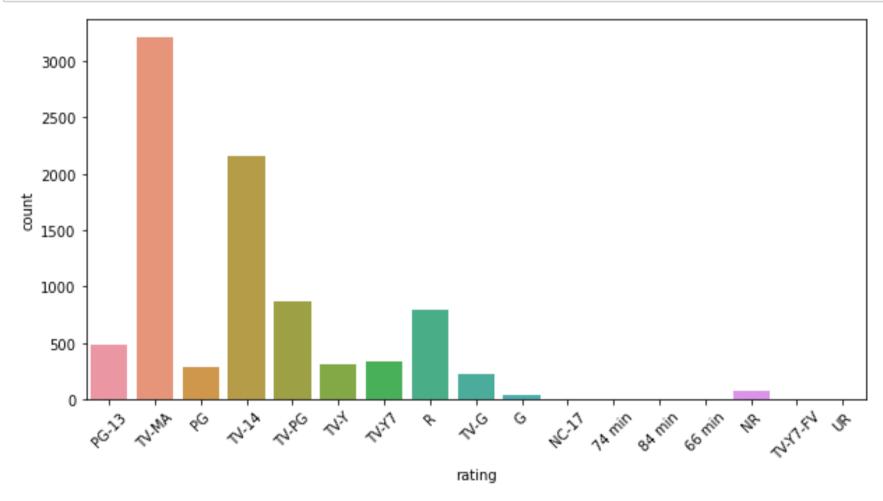
In [17]:

```
fig = plt.figure(figsize = (20,5))
sns.countplot(x= 'release_year', data = df)
plt.xticks(rotation = 90)
plt.show()
```



In [18]:

```
fig = plt.figure(figsize = (10,5))
sns.countplot(x= 'rating', data = df)
plt.xticks(rotation = 45)
plt.show()
```



In [19]:

```
df.loc[df['rating']=='74 min']
```

Out[19]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	duratio
5541	s5542	Movie	Louis C.K. 2017		Louis C.K.	United States	2017-04-04	2017	74 min	Nai

```
In [20]:
```

```
df.loc[df['rating']=='84 min']
```

Out[20]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	dura
5794	s5795	Movie	Louis C.K.: Hilarious	Louis C.K.		United States	2016-09-16	2010	84 min	

In [21]:

```
df.loc[df['rating']=='66 min']
```

Out[21]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	dura
5813	s5814	Movie	Louis C.K.: Live at the Comedy Store	Louis C.K.	Louis C.K.	United States	2016-08-15	2015	66 min	ı

In [22]:

```
df['listed_in'].value_counts()
```

Out[22]:

```
362
Dramas, International Movies
Documentaries
                                                       359
Stand-Up Comedy
                                                       334
Comedies, Dramas, International Movies
                                                       274
Dramas, Independent Movies, International Movies
                                                       252
Kids' TV, TV Action & Adventure, TV Dramas
TV Comedies, TV Dramas, TV Horror
Children & Family Movies, Comedies, LGBTQ Movies
Kids' TV, Spanish-Language TV Shows, Teen TV Shows
                                                         1
Cult Movies, Dramas, Thrillers
Name: listed in, Length: 514, dtype: int64
```

In [23]:

Missing value Imputation

```
In [24]:
df['director'] = df['director'].fillna('missing')
In [25]:
df['director'].isna().sum()
Out[25]:
0
In [26]:
df['cast'] = df['cast'].fillna('missing')
In [27]:
country_mode = df['country'].mode()[0]
country_mode
Out[27]:
'United States'
```

```
In [28]:
df['country'] = df['country'].fillna(country mode)
In [29]:
df['date added'].fillna(df['date added'].mode()[0], inplace = True)
In [30]:
# Correcting the wrongly written values in the rating columns to duration column for the re
# imputing the corresponding rating cells with nan values...This will treat the missing val
# missing value in the rating column instead...post this step we will have to do missing value
# column
```

In [31]:

```
df.at[5541,'duration'] = df.at[5541,'rating']
df.at[5794,'duration'] = df.at[5794,'rating']
df.at[5813,'duration'] = df.at[5813,'rating']
```

```
In [32]:
df.at[5813,'duration']
Out[32]:
'66 min'
In [33]:
df.at[5541,'rating'] = np.nan
df.at[5794,'rating'] = np.nan
df.at[5813,'rating'] = np.nan
In [34]:
df.at[5541,'rating']
Out[34]:
```

nan

```
In [35]:
```

```
df['rating'].fillna(df['rating'].mode()[0], inplace = True)
```

In [36]:

Convert date_added column to datetime and add year and month column

In [37]:

```
df['date_added'] = pd.to_datetime(df['date_added'])
df['DA_year'] = df['date_added'].dt.year
df['DA_month'] = df['date_added'].dt.month_name().str[:3]
```

In [38]:

Treating duration column to remove min and seasons string, so that we can use the information

In [39]:

```
df['duration']= df['duration'].str.split(' ').apply(lambda x: x[0])
df.head(20)
```

Out[39]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	duratic
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	missing	United States	2021-09-25	2020	PG- 13	(
1	s2	TV Show	Blood & Water	missing	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	2021-09-24	2021	TV- MA	
4.6		TV		.lulien	Sami Bouajila, Tracy	l Inited			TV-	

```
In [41]:
```

```
df['duration'] = df['duration'].astype(int)
```

In [42]:

df.info()

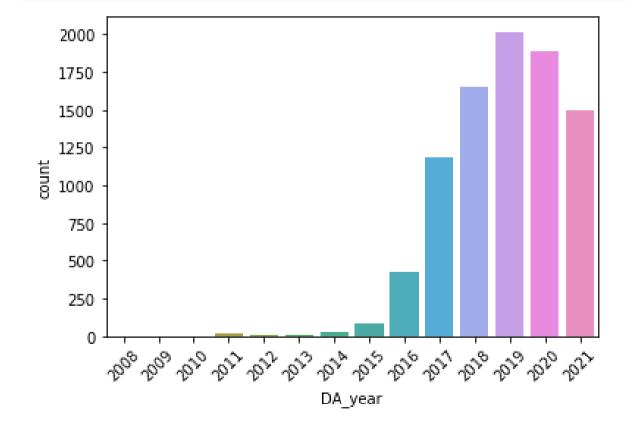
```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 8807 entries, 0 to 8806
Data columns (total 14 columns):
                  Non-Null Count Dtype
    Column
0
   show id
                  8807 non-null
                                  object
    type
                  8807 non-null
                                  object
 1
 2
    title
                  8807 non-null
                                  object
 3
    director
                  8807 non-null
                                  object
                                  object
 4
    cast
                  8807 non-null
                                  object
    country
                  8807 non-null
                                  datetime64[ns]
 6
    date added
                  8807 non-null
 7
    release year
                  8807 non-null
                                  int64
    rating
 8
                  8807 non-null
                                  object
    duration
 9
                  8807 non-null
                                  int32
 10
    listed in
                  8807 non-null
                                  object
 11
   description
                  8807 non-null
                                  object
 12
    DA year
                  8807 non-null
                                  int64
    DA month
                  8807 non-null
                                  object
 13
dtypes: datetime64[ns](1), int32(1), int64(2), object(10)
memory usage: 929.0+ KB
```

In [161]:

Univariate and bivariate analysis

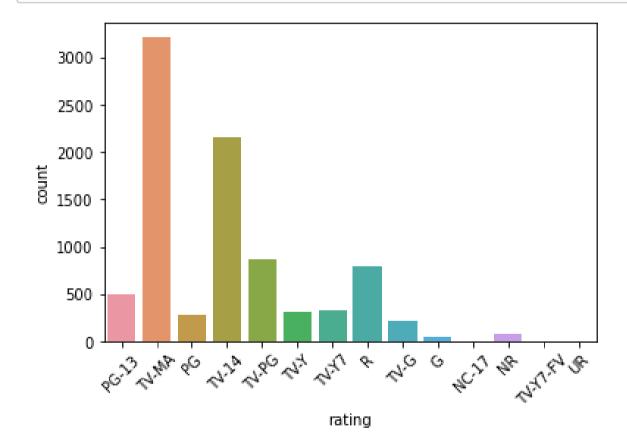
In [162]:

```
sns.countplot(x = 'DA_year', data = df)
plt.xticks(rotation = 45)
plt.show()
```



In [163]:

```
sns.countplot(x = 'rating', data = df)
plt.xticks(rotation = 45)
plt.show()
```



In [164]:

```
# creating different dataframe for movies and TV shows
```

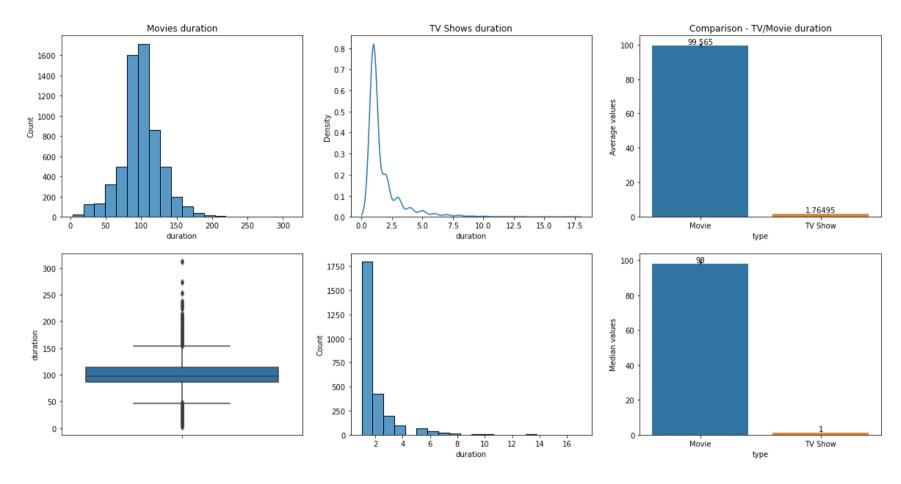
In [165]:

```
df_movies = df.loc[df['type'] == 'Movie']
df_TV = df.loc[df['type']=='TV Show']
```

In [166]:

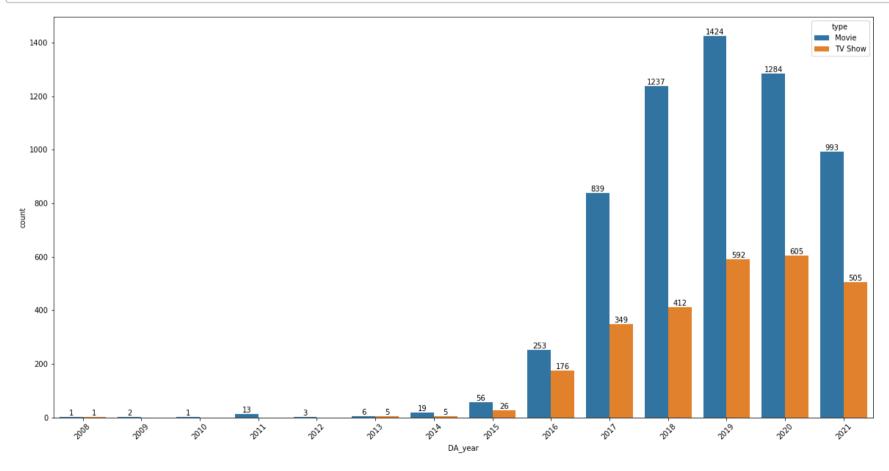
```
fig = plt.figure(figsize = (20,10))
plt.subplot(2,3,1)
sns.histplot(df movies['duration'], bins = 20)
plt.title('Movies duration')
plt.subplot(2,3,4)
sns.boxplot(y= 'duration', data = df movies)
plt.subplot(2,3,2)
sns.kdeplot(df TV['duration'])
plt.title('TV Shows duration')
plt.subplot(2,3,5)
sns.histplot(df TV['duration'], bins = 20)
plt.subplot(2,3,3)
ax = sns.barplot(x = 'type', y = 'duration', data = df)
ax.bar label(ax.containers[0])
plt.ylabel('Average values')
plt.title('Comparison - TV/Movie duration')
plt.subplot(2,3,6)
ax = sns.barplot(x = 'type', y = 'duration', data = df, estimator = np.median)
ax.bar label(ax.containers[0])
```

Text(0, 0.5, 'Median values')



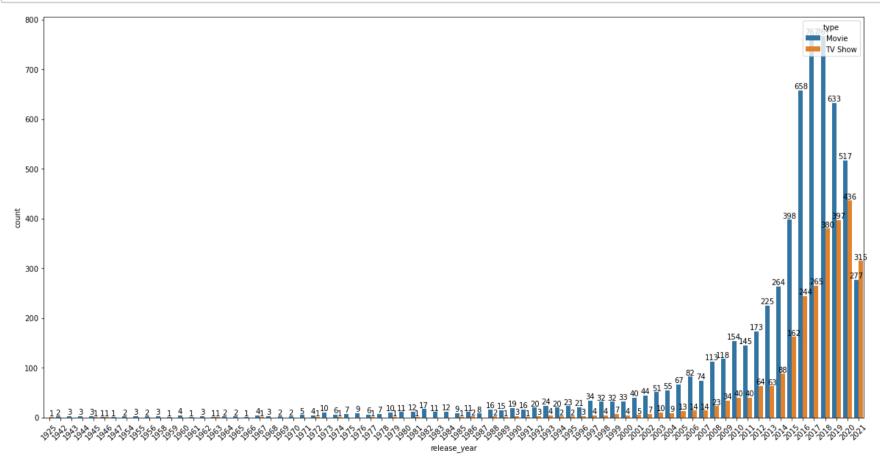
In [56]:

```
fig = plt.figure(figsize = (20,10))
ax = sns.countplot(x= 'DA_year', data = df, hue = 'type')
for i in ax.containers:
    ax.bar_label(i,)
plt.xticks(rotation = 45)
plt.show()
```



In [57]:

```
fig = plt.figure(figsize = (20,10))
ax = sns.countplot(x= 'release_year', data = df, hue = 'type')
for i in ax.containers:
    ax.bar_label(i,)
plt.xticks(rotation = 45)
plt.show()
```



```
In [81]:

df['date_added'].min()

Out[81]:
    Timestamp('2008-01-01 00:00:00')

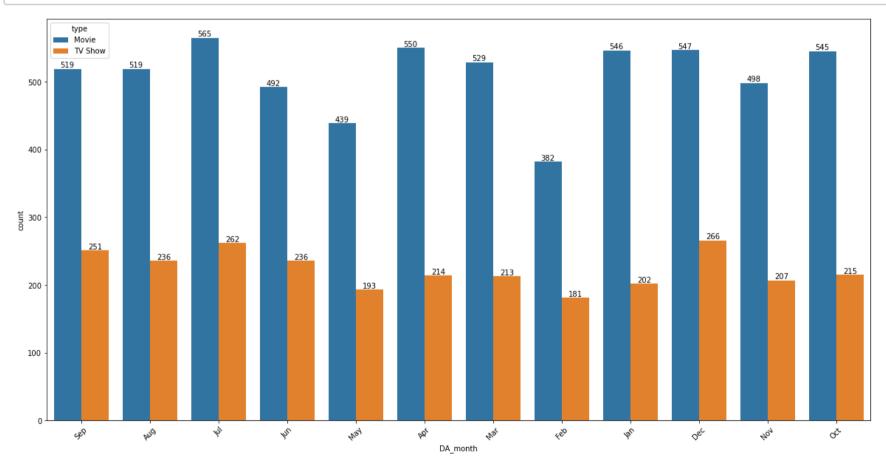
In [82]:

df['date_added'].max()

Out[82]:
    Timestamp('2021-09-25 00:00:00')
```

In [60]:

```
fig = plt.figure(figsize = (20,10))
ax = sns.countplot(x= 'DA_month', data = df, hue = 'type')
for i in ax.containers:
    ax.bar_label(i,)
plt.xticks(rotation = 45)
plt.show()
```



In []:

To see if there is a lag in the movies or TV shows production and the time that they are

```
In [43]:
```

```
df_cut = df.loc[df['release_year']>= 2015]
df_cut.head()
```

Out[43]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	C
0	s 1	Movie	Dick Johnson Is Dead	Kirsten Johnson	missing	United States	2021-09-25	2020	PG- 13	
1	s2	TV Show	Blood & Water	missing	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	2021-09-24	2021	TV- MA	
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	United States	2021-09-24	2021	TV- MA	
3	s4	TV Show	Jailbirds New Orleans	missing	missing	United States	2021-09-24	2021	TV- MA	

	show_id	type	title	director	cast	country	date_added	release_year	rating	С
•	4 s5	TV Show	Kota Factory	missing	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	2021-09-24	2021	TV- MA	

```
In [44]:
```

```
df_cut['lag'] = df_cut['DA_year']-df_cut['release_year']
df_cut['lag'].value_counts()
```

C:\Users\91981\AppData\Local\Temp\ipykernel_7456\2803299873.py:1: SettingWit
hCopyWarning:

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 (https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)

df_cut['lag'] = df_cut['DA_year']-df_cut['release_year']

```
Out[44]:

IB [46]3216

#1Unnesterg the data - cast column
2 684

3 394

IA [47]207

5 98
cast_split = df['cast'].apply(lambda x: str(x).split(',')).to_list()
-1 12
-2 1
-3 1

Name: lag, dtype: int64
```

In [48]:

```
df_new = pd.DataFrame(cast_split, index= df['title'])
df_new.head()
```

Out[48]:

	0	1	2	3	4	5	6	7
title								
Dick Johnson Is Dead	missing	None	None	None	None	None	None	None
Blood & Water	Ama Qamata	Khosi Ngema	Gail Mabalane	Thabang Molaba	Dillon Windvogel	Natasha Thahane	Arno Greeff	Xolile Tshabalala
Ganglands	Sami Bouajila	Tracy Gotoas	Samuel Jouy	Nabiha Akkari	Sofia Lesaffre	Salim Kechiouche	Noureddine Farihi	Geert Var Rampelberg
Jailbirds New Orleans	missing	None	None	None	None	None	None	None
Kota Factory	Mayur More	Jitendra Kumar	Ranjan Raj	Alam Khan	Ahsaas Channa	Revathi Pillai	Urvi Singh	Arun Kumaı

5 rows × 50 columns

```
In [49]:
```

```
df_new = df_new.stack()
```

In [50]:

df_new.head(30)

Out[50]:

ti	tle		
Di	ck Johnson Is Dead	d 0	missing
Bl	ood & Water	0	Ama Qamata
		1	Khosi Ngema
		2	Gail Mabalane
		3	Thabang Molaba
Tn	[51]:	4	Dillon Windvogel
	[2+].	5	Natasha Thahane
df	_new = pd.DataFran	ne(d 6 _n	ew) Arno Greeff
df	_new.reset_index(:	inpl ä ce	= True Xolile Tshabalala
df	_new.head()	8	Getmore Sithole
		9	Cindy Mahlangu
Ou ⁻	t[51]:	10	Ryle De Morny
		11	Greteli Fincham
	4:41 -	12	Sello Maake Ka-Ncube
	title	12 level <u>1</u> 3	Odwa Gwanya
0	title Dick Johnson Is Dead	12 level 13 14	0dwa Gwanya _{miss} Mekaila Mathys
	Dick Johnson Is Dead	14 15	0dwa Gwanya _{miss} Mekaila Mathys Sandi Schultz
0		level <u>1</u> 4	Odwa Gwanya _{miss} Mekaila Mathys Sandi Schultz ^{Ama Qam} otane Williams
	Dick Johnson Is Dead	14 15 16 17	Odwa Gwanya missMekaila Mathys Sandi Schultz Ama Qamotane Williams Khosi Ngema
1 2	Dick Johnson Is Dead Blood & Water Blood & Water	14 15 16 17 18	Odwa Gwanya misshekaila Mathys Sandi Schultz Ama Qamatane Williams Khosi Ngema Patrick Mofokeng
1 2	Dick Johnson Is Dead Blood & Water	140 15 160 17 18 02	Odwa Gwanya misshekaila Mathys Sandi Schultz Ama Qametane Williams Khosi Ngema illa Miller Patrick Mofokeng Gail Mabalangami Bouajila
1 2	Dick Johnson Is Dead Blood & Water Blood & Water	140 15 160 17 18 02 13	Odwa Gwanya missingkaila Mathys Sandi Schultz Ama Qamatane Williams Khosi Ngema Patrick Mofokeng Gail Mabalangami Bouajila Thabang Molaba
1 2 63	Dick Johnson Is Dead Blood & Water Blood & Water ngland Blood & Water	140 15 160 17 18 02 13 2	Odwa Gwanya missingkaila Mathys Sandi Schultz Ama Qamptane Williams Khosi Ngemia Miller Patrick Mofokeng Gail Mabalangami Bouajila Thabang Molaba Tracy Gotoas Samuel Jouy
1 2 63	Dick Johnson Is Dead Blood & Water Blood & Water ngland Blood & Water	140 150 160 171 180 021 132 3	Odwa Gwanya missingkaila Mathys Sandi Schultz Ama Qamptane Williams Khosi Ngemailla Miller Patrick Mofokeng Gail Mabalangami Bouajila Thabang Molaba Tracy Gotoas Samuel Jouy Nabiha Akkari
1 2 63	Dick Johnson Is Dead Blood & Water Blood & Water ngland Blood & Water	140 15 160 17 18 02 1 ₃ 2 3 4	Odwa Gwanya misshigkaila Mathys Sandi Schultz Ama Qamotane Williams Khosi Ngemia Patrick Mofokeng Gail Mabalargami Bouajila Thabang Molaba Tracy Gotoas Samuel Jouy Nabiha Akkari Sofia Lesaffre
1 2 63	Dick Johnson Is Dead Blood & Water Blood & Water ngland Blood & Water	140 150 160 171 180 021 132 3	Odwa Gwanya missingkaila Mathys Sandi Schultz Ama Qamptane Williams Khosi Ngema illa Miller Patrick Mofokeng Gail Mabalangami Bouajila Thabang Molaba Tracy Gotoas Samuel Jouy Nabiha Akkari

```
In [52]:

8 Bakary Diombera

Jailbirds New Orleans 0 axis = 1, inplace = missing divpe: Object object new.columns = ['title','cast']

In [53]:
```

df_new.shape

Out[53]:

(64951, 2)

```
In [54]:
```

```
df_new['cast'].value_counts()[:10]
```

Out[54]:

missing	825
Anupam Kher	39
Rupa Bhimani	31
Takahiro Sakurai	30
Julie Tejwani	28
Om Puri	27
Shah Rukh Khan	26
Rajesh Kava	26
Andrea Libman	25
Paresh Rawal	25
Name: cast, dtype:	int64

In [55]:

```
df_new['cast'].nunique()
```

Out[55]:

39297

In [56]:

```
# Unnesting the data - Director column
```

In [57]:

```
dir_split = df['director'].apply(lambda x: str(x).split(',')).to_list()
df_dir = pd.DataFrame(dir_split,index = df['title'])
df_dir = df_dir.stack()
df_dir = pd.DataFrame(df_dir)
```

In [58]:

df_dir.head(20)

0

title		
Dick Johnson Is Dead	0	Kirsten Johnson
Blood & Water	0	missing
Ganglands	0	Julien Leclercq
Jailbirds New Orleans	0	missing
Kota Factory	0	missing
Midnight Mass	0	Mike Flanagan
My Little Pony: A New Generation	0	Robert Cullen
	1	José Luis Ucha
Sankofa	0	Haile Gerima
The Great British Baking Show	0	Andy Devonshire
The Starling	0	Theodore Melfi
Vendetta: Truth, Lies and The Mafia	0	missing
Bangkok Breaking	0	Kongkiat Komesiri
Je Suis Karl	0	Christian Schwochow
Confessions of an Invisible Girl	0	Bruno Garotti

•	•	4		
T	ı	T	ı	Δ
				-

Crime Stories: India Detectives 0 missing

Dear White People 0 missing

Europe's Most Dangerous Man: Otto Skorzeny in Spain 0 Pedro de Echave García

1 Pablo Azorín Williams

In [59]: Falsa identidad 0 missing

```
df_dir = pd.DataFrame(df_dir)
df_dir.reset_index(inplace=True)
df_dir.head()
```

Out[59]:

	title	level_1	0
0	Dick Johnson Is Dead	0	Kirsten Johnson
1	Blood & Water	0	missing
2	Ganglands	0	Julien Leclercq
3	Jailbirds New Orleans	0	missing
4	Kota Factory	0	missing

```
In [60]:

df_dir.drop('level_1', axis= 1, inplace = True)

In [61]:

df_dir.shape

Out[61]:

(9612, 2)

In [62]:

df_dir.columns = ['title','director']
```

In [63]:

```
df_dir['director'].value_counts()[:10]
```

Out[63]:

missing	2634
Rajiv Chilaka	22
Jan Suter	18
Raúl Campos	18
Marcus Raboy	16
Suhas Kadav	16
Jay Karas	15
Cathy Garcia-Molina	13
Martin Scorsese	12
Jay Chapman	12
Name: director, dtype:	int64

In [64]:

```
df_dir['director'].nunique()
```

Out[64]:

5121

In [65]:

```
# unnesting - Listed_in variable
```

In [66]:

```
gen_split = df['listed_in'].apply(lambda x: str(x).split(',')).to_list()
df_gen = pd.DataFrame(gen_split,index = df['title'])
df_gen = df_gen.stack()
df_gen = pd.DataFrame(df_gen)
df_gen.reset_index(inplace = True)
df_gen.drop('level_1', axis = 1, inplace = True)
df_gen.columns = ['title', 'listed_in']
```

In [67]:

df_gen.head()

Out[67]:

	title	listed_in
0	Dick Johnson Is Dead	Documentaries
1	Blood & Water	International TV Shows
2	Blood & Water	TV Dramas
3	Blood & Water	TV Mysteries
4	Ganglands	Crime TV Shows

In [68]:

```
df_gen['listed_in'].value_counts()[:10]
```

Out[68]:

International Movies	2624
Dramas	1600
Comedies	1210
Action & Adventure	859
Documentaries	829
Dramas	827
International TV Shows	774
Independent Movies	736
TV Dramas	696
Romantic Movies	613
<pre>Name: listed_in, dtype:</pre>	int64

In [69]:

```
df_gen.shape
```

Out[69]:

(19323, 2)

```
In [70]:
df gen['listed in'].nunique()
Out[70]:
73
In [71]:
# Unnesting country column
In [72]:
c_split = df['country'].apply(lambda x: str(x).split(',')).to_list()
df c = pd.DataFrame(c split,index = df['title'])
df_c = df_c.stack()
df_c = pd.DataFrame(df_c)
df_c.reset_index(inplace = True)
df_c.drop('level_1', axis = 1, inplace = True)
```

df c.columns = ['title', 'country']

In [73]:

df_c.head()

Out[73]:

	title	country
0	Dick Johnson Is Dead	United States
1	Blood & Water	South Africa
2	Ganglands	United States
3	Jailbirds New Orleans	United States
4	Kota Factory	India

In [74]:

```
df_c['country'].value_counts()[:10]
```

Out[74]:

United States	4042			
India	1008			
United Kingdom	628			
United States	479			
Canada	271			
Japan	259			
France	212			
South Korea	211			
Spain	181			
France	181			
Namas cauntos	d+vna. +n+c			

Name: country, dtype: int64

In [75]:

```
df_c['country'].nunique()
```

Out[75]:

197

```
In [76]:

df_c.shape

Out[76]:

(10850, 2)

In [77]:

# Merging the datasets to the final dataset - for this we will have to drop the nested coli # and director from the original dataset
```

In [78]:

```
df_st1 =df
df_st1.drop(['cast','country','director','listed_in'], axis=1, inplace = True)
```

In [79]:

df_st1.head()

Out[79]:

	show_id	type	title	date_added	release_year	rating	duration	description	DA_year
0	s1	Movie	Dick Johnson Is Dead	2021-09-25	2020	PG- 13	90	As her father nears the end of his life, filmm	2021
1	s2	TV Show	Blood & Water	2021-09-24	2021	TV- MA	2	After crossing paths at a party, a Cape Town t	2021
2	s3	TV Show	Ganglands	2021-09-24	2021	TV- MA	1	To protect his family from a powerful drug lor	2021
3	s4	TV Show	Jailbirds New Orleans	2021-09-24	2021	TV- MA	1	Feuds, flirtations and toilet talk go down amo	2021

```
show_id
                         title date_added release_year rating duration description DA_year
              type
                                                                         In a city of
                                                                          coaching
                                                         TV-
                         Kota
In [80]:<sup>$5</sup>
                               2021-09-24
                                                 2021
                                                                                       2021
                                                                           centers
             Show
                      Factory
                                                          MA
                                                                          known to
                                                                           train I...
# Merge df_new to df_st1 (Adding cast info)
In [81]:
df_st2 = df_st1.merge(df_new, on = 'title', how = 'left')
df_st2.shape
Out[81]:
(64951, 11)
```

merge df_dir to df_st2 (Adding director information)

In [82]:

```
In [83]:
df_st3 = df_st2.merge(df_dir, on = 'title', how = 'left')
df_st3.shape
Out[83]:
(70812, 12)
In [84]:
# merge df_c to df_st3 ( Adding country information)
In [85]:
df_st4 = df_st3.merge(df_c, on = 'title', how = 'left')
In [86]:
df_st4.shape
Out[86]:
(89415, 13)
```

```
In [87]:
# merge df_gen to df_st4 (Adding genre information)
In [88]:
final = df_st4.merge(df_gen, on = 'title', how = 'left')
In [89]:
final.shape
Out[89]:
(202065, 14)
In [90]:
final.drop_duplicates(inplace = True)
```

In [91]:

final.shape

Out[91]:

(202058, 14)

In [92]:

final.head()

Out[92]:

	show_id	type	title	date_added	release_year	rating	duration	description	DA_year
0	s1	Movie	Dick Johnson Is Dead	2021-09-25	2020	PG- 13	90	As her father nears the end of his life, filmm	2021
1	s2	TV Show	Blood & Water	2021-09-24	2021	TV- MA	2	After crossing paths at a party, a Cape Town t	2021
2	s2	TV Show	Blood & Water	2021-09-24	2021	TV- MA	2	After crossing paths at a party, a Cape Town t	2021
3	s2	TV Show	Blood & Water	2021-09-24	2021	TV- MA	2	After crossing paths at a party, a Cape Town t	2021

In [94]:

To understand key metrics for deriving business insights, we ddivide the final dataset in

In [95]:

```
movie_f = final.loc[final['type']=='Movie']
TV_f = final.loc[final['type']=='TV Show']
```

In [96]:

movie_f.head()

Out[96]:

	show_id	type	title	date_added	release_year	rating	duration	description	DA_y€
0	s1	Movie	Dick Johnson Is Dead	2021-09-25	2020	PG- 13	90	As her father nears the end of his life, filmm	20
159	s 7	Movie	My Little Pony: A New Generation	2021-09-24	2021	PG	91	Equestria's divided. But a bright- eyed hero be	20
160	s 7	Movie	My Little Pony: A New Generation	2021-09-24	2021	PG	91	Equestria's divided. But a bright- eyed hero be	20
161	s7	Movie	My Little Pony: A New Generation	2021-09-24	2021	PG	91	Equestria's divided. But a bright- eyed hero be	20

show_id	type	title	date_added	release_year	rating	duration	description	DA_ye
In [97]:		My Little					Equestria's divided. But	
# Popular a		Pony: A ectoNewa Generation	2021-09-24 irs	2021	PG	91	a bright- eyed hero be	20

In [98]:

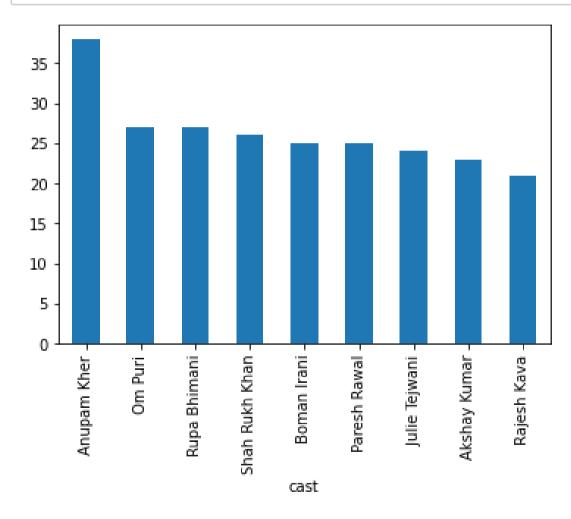
movie_f.groupby(['cast','director'])['title'].nunique().sort_values(ascending = False)[:10]

Out[98]:

cast	director	
missing	missing	54
Julie Tejwani	Rajiv Chilaka	19
Rajesh Kava	Rajiv Chilaka	19
Rupa Bhimani	Rajiv Chilaka	18
Jigna Bhardwaj	Rajiv Chilaka	18
Vatsal Dubey	Rajiv Chilaka	16
Swapnil	Rajiv Chilaka	13
Mousam	Rajiv Chilaka	13
David Spade	missing	11
Fortune Feimster	missing	11
Name: title, dtype	: int64	

In [161]:

```
m_cast = movie_f.groupby(['cast'])['title'].nunique().sort_values(ascending = False)
m_cast[1:10].plot(kind = 'bar')
plt.show()
```



In [144]:

```
movie_f.groupby(['director'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[144]:

director	
missing	188
Rajiv Chilaka	22
Jan Suter	18
Raúl Campos	18
Suhas Kadav	16
Jay Karas	15
Marcus Raboy	15
Cathy Garcia-Molina	13
Martin Scorsese	12
Youssef Chahine	12
Name: title, dtype:	int64

In [145]:

```
TV_f.groupby(['cast'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[145]:

cast	
missing	350
Takahiro Sakurai	24
Yuki Kaji	17
Junichi Suwabe	17
Ai Kayano	17
Daisuke Ono	14
David Attenborough	14
Takehito Koyasu	13
Yoshimasa Hosoya	13
Yuichi Nakamura	13
Name: title, dtype:	int64

In [102]:

```
TV_f.groupby(['director'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[102]:

director	
missing	2446
Ken Burns	3
Alastair Fothergill	3
Gautham Vasudev Menon	2
Iginio Straffi	2
Joe Berlinger	2
Jung-ah Im	2
Rob Seidenglanz	2
Shin Won-ho	2
Stan Lathan	2
Name: title, dtvpe: int64	

In [103]:

```
TV_f.groupby(['cast','director'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[103]:

cast	director	
missing	missing	298
Takahiro Sakurai	missing	23
Yuki Kaji	missing	16
Junichi Suwabe	missing	16
Ai Kayano	missing	15
Yoshimasa Hosoya	missing	13
Yuichi Nakamura	missing	13
Daisuke Ono	missing	13
Takehito Koyasu	missing	12
David Attenborough	missing	11
Name: title, dtype:	int64	

In [104]:

Popular genre by type(movies/TV shows)

In [141]:

```
movie_f.groupby(['listed_in'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[141]:

listed_in	
International Movies	2624
Dramas	1600
Comedies	1210
Action & Adventure	859
Documentaries	829
Dramas	827
Independent Movies	736
Romantic Movies	613
Children & Family Movies	605
Thrillers	512
Name: title, dtype: int64	

In [142]:

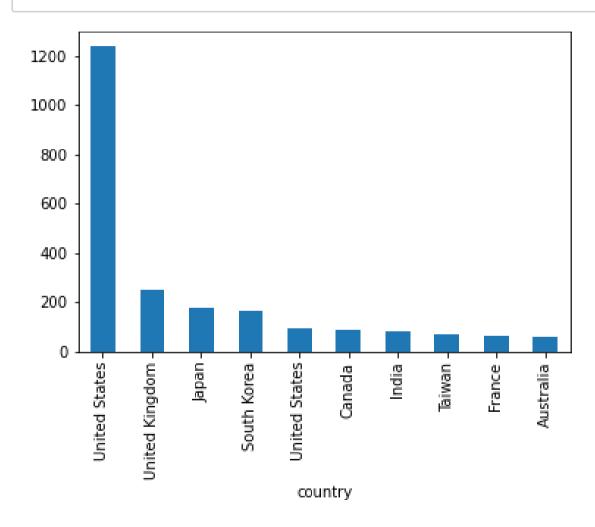
```
TV_f.groupby(['listed_in'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[142]:

listed_in	
International TV Shows	774
TV Dramas	696
International TV Shows	577
TV Comedies	461
Crime TV Shows	399
Kids' TV	388
Romantic TV Shows	338
British TV Shows	253
Docuseries	221
Anime Series	176
Name: title, dtype: int64	

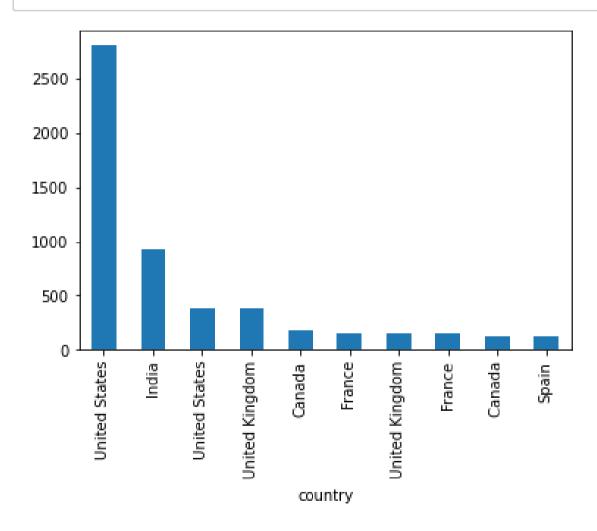
In [163]:

```
TV_f.groupby(['country'])['title'].nunique().sort_values(ascending = False)[:10].plot(kind plt.show()
```



In [162]:

```
movie_f.groupby(['country'])['title'].nunique().sort_values(ascending = False)[:10].plot(k:
plt.show()
```



In [109]:

```
movie_f.groupby(['DA_month'])['title'].nunique().sort_values(ascending = False)
```

Out[109]:

```
DA_month
Jul
       565
Apr
       550
Dec
       547
Jan
       546
0ct
       545
Mar
       529
Aug
       519
       519
Sep
Nov
       498
Jun
       492
       439
May
Feb
       382
Name: title, dtype: int64
```

In [110]:

```
TV_f.groupby(['DA_month'])['title'].nunique().sort_values(ascending = False)
```

Out[110]:

```
DA_month
Dec
       266
Jul
       262
Sep
       251
       236
Aug
       236
Jun
Oct
       215
Apr
       214
Mar
       213
Nov
       207
Jan
       202
May
       193
       181
Feb
Name: title, dtype: int64
```

In [111]:

```
movie_f['DA_week'] = movie_f['date_added'].dt.isocalendar().week
TV_f['DA_week'] = TV_f['date_added'].dt.isocalendar().week
```

C:\Users\91981\AppData\Local\Temp\ipykernel_7456\548383386.py:1: SettingWith
CopyWarning:

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 (https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)

movie_f['DA_week'] = movie_f['date_added'].dt.isocalendar().week
C:\Users\91981\AppData\Local\Temp\ipykernel_7456\548383386.py:2: SettingWith
CopyWarning:

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 (https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)

TV_f['DA_week'] = TV_f['date_added'].dt.isocalendar().week

In [112]:

movie_f.head()

Out[112]:

	show_id	type	title	date_added	release_year	rating	duration	description	DA_ye
0	s1	Movie	Dick Johnson Is Dead	2021-09-25	2020	PG- 13	90	As her father nears the end of his life, filmm	20
159	s7	Movie	My Little Pony: A New Generation	2021-09-24	2021	PG	91	Equestria's divided. But a bright- eyed hero be	20
160	s7	Movie	My Little Pony: A New Generation	2021-09-24	2021	PG	91	Equestria's divided. But a bright- eyed hero be	20
161	s7	Movie	My Little Pony: A New Generation	2021-09-24	2021	PG	91	Equestria's divided. But a bright- eyed hero be	20

	show_id	type	title	date_added	release_year	rating	duration	description	DA_ye
162	s7	Movie	My Little Pony: A New Generation	2021-09-24	2021	PG	91	Equestria's divided. But a bright- eyed hero be	20

In [113]:

```
genre_counts = movie_f.groupby(['DA_week', 'listed_in']).size().reset_index(name='Count')
most_popular_genre = genre_counts.groupby('DA_week')['listed_in', 'Count'].apply(
lambda x: x.loc[x['Count'].idxmax()]
)
most_popular_genre
```

```
C:\Users\91981\AppData\Local\Temp\ipykernel_7456\4030375247.py:3: FutureWarn
ing: Indexing with multiple keys (implicitly converted to a tuple of keys) w
ill be deprecated, use a list instead.
  most_popular_genre = genre_counts.groupby('DA_week')['listed_in', 'Coun
t'].apply(
```

Out[113]:

	listed_in	Count
DA_week		
1	International Movies	1177
2	International Movies	314
3	International Movies	351
4	International Movies	266
5	International Movies	713
6	Comedies	254
7	International Movies	504
8	International Movies	359
9	International Movies	1071
10	International Movies	553
11	International Movies	476
12	International Movies	306
13	Dramas	675
14	International Movies	412
15	Comedies	669

DA_week		
16	International Movies	549
17	International Movies	403
18	International Movies	805
19	International Movies	330
20	International Movies	383
21	International Movies	412
22	Dramas	562
23	International Movies	553
24	International Movies	452
25	International Movies	613
26	International Movies	877
27	International Movies	792
28	Dramas	466
29	International Movies	429
30	International Movies	422

International Movies

876

31

DA week

32	International Movies	223
33	International Movies	437
34	International Movies	586
35	International Movies	837
36	International Movies	423
37	International Movies	529
38	International Movies	542
39	Children & Family Movies	717
40	International Movies	922
41	International Movies	455
42	International Movies	450
43	International Movies	503
44	International Movies	812
45	International Movies	288
46	International Movies	259
47	International Movies	206

In [114]:

DA_week		
48	International Movies	940
49	International Movies	335
50	International Movies	494
51	Dramas	406
52	International Movies	291
53	Action & Adventure	218

Out[114]:

	show_id	type	title	date_added	release_year	rating	duration	description	DA_year	DA
1	s2	TV Show	Blood & Water	2021-09-24	2021	TV- MA	2	After crossing paths at a party, a Cape Town t	2021	
2	s2	TV Show	Blood & Water	2021-09-24	2021	TV- MA	2	After crossing paths at a party, a Cape Town t	2021	
3	s2	TV Show	Blood & Water	2021-09-24	2021	TV- MA	2	After crossing paths at a party, a Cape Town t	2021	
4	s2	TV Show	Blood & Water	2021-09-24	2021	TV- MA	2	After crossing paths at a party, a Cape Town t	2021	

_	show_id	type	title	date_added	release_year	rating	duration	description	DA_year	DA
	5 s2	TV Show	Blood & Water	2021-09-24	2021	TV- MA	2	After crossing paths at a party, a Cape Town t	2021	

In [115]:

```
TV_counts = TV_f.groupby(['DA_week', 'listed_in']).size().reset_index(name='Count')
TV_popular_genre = TV_counts.groupby('DA_week')['listed_in', 'Count'].apply(
lambda x: x.loc[x['Count'].idxmax()]
)
TV_popular_genre
```

```
C:\Users\91981\AppData\Local\Temp\ipykernel_7456\3697046180.py:3: FutureWarn
ing: Indexing with multiple keys (implicitly converted to a tuple of keys) w
ill be deprecated, use a list instead.
   TV_popular_genre = TV_counts.groupby('DA_week')['listed_in', 'Count'].appl
y(
```

Out[115]:

listed_in Count

	–	
DA_week		
1	Anime Series	135
2	TV Dramas	149
3	International TV Shows	98
4	TV Dramas	147
5	Kids' TV	202
6	TV Dramas	117
7	TV Dramas	246
8	International TV Shows	155
9	International TV Shows	123
10	International TV Shows	124
11	International TV Shows	139
12	TV Dramas	164
13	International TV Shows	280
14	International TV Shows	169
15	TV Dramas	161

DA_week

16	International TV Shows	85
17	International TV Shows	142
18	TV Dramas	211
19	TV Dramas	336
20	International TV Shows	137
21	International TV Shows	138
22	TV Dramas	230
23	TV Dramas	149
24	TV Dramas	298
25	International TV Shows	206
26	TV Dramas	340
27	International TV Shows	319
28	International TV Shows	86
29	International TV Shows	88
30	TV Action & Adventure	91
31	International TV Shows	235

DA_	_week

	32	International TV Shows	130
	33	TV Dramas	267
	34	TV Dramas	138
	35	TV Dramas	307
	36	TV Dramas	126
	37	TV Dramas	144
	38	TV Dramas	179
	39	International TV Shows	136
	40	British TV Shows	167
	41	International TV Shows	136
In	[1162]:	TV Dramas	122
	12	T\/ Mystorias	71

Similar analysis for the top countries where Netflix has a strong presence like United Si

44 International TV Shows 182

45 International TV Shows 117

46 TV Dramas 167

47 International TV Shows 116

```
listed in Count
In [117]:
DA week
df_US = final.loc[final['country'].str.contains('United States|US')]
df_ind48 ±ntfinationalot/[shiowesl['cauhtry'].str.contains('India')]
df_UK final.loc[final['country'].str.contains('United Kingdom|UK')]
      50 International TV Shows
                               239
In [118]:
                   TV Dramas
                               200
df_US.shape 52
                   TV Dramas
                               157
Out[118]:
                     Kids' TV
                               583
(71246, 14)
In [119]:
df_india.shape
Out[119]:
(22814, 14)
```

In [120]:

df_UK.shape

Out[120]:

(12965, 14)

In [121]:

```
genre_counts = df_US.groupby(['DA_month', 'listed_in']).size().reset_index(name='Count')
most_popular_genre = genre_counts.groupby('DA_month')['listed_in', 'Count'].apply(
lambda x: x.loc[x['Count'].idxmax()]
)
most_popular_genre
```

```
C:\Users\91981\AppData\Local\Temp\ipykernel_7456\1146318166.py:3: FutureWarn
ing: Indexing with multiple keys (implicitly converted to a tuple of keys) w
ill be deprecated, use a list instead.
   most_popular_genre = genre_counts.groupby('DA_month')['listed_in', 'Coun
t'].apply(
```

Out[121]:

Sep

Action & Adventure

516

	listed_in	Count
DA_month		
Apr	Comedies	865
Aug	Dramas	561
Dec	Children & Family Movies	505
Feb	Dramas	442
Jan	Comedies	714
In [122]ul	Children & Family Movies	687
# Populur	actorAction የፌዲቀላዎ nturge	nr& ⁷ &n
Mar	Dramas	428
Мау	Dramas	408
Nov	Action & Adventure	522
Oct	Children & Family Movies	768

In [146]:

```
df_US.groupby(['cast'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[146]:

cast	
missing	561
Rupa Bhimani	25
Andrea Libman	22
Fred Tatasciore	21
Julie Tejwani	21
Adam Sandler	20
Rajesh Kava	19
Vincent Tong	18
Jigna Bhardwaj	18
Fortune Feimster	16
Name: title, dtype:	int64

In [147]:

```
df_US.groupby(['director'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[147]:

director	
missing	1349
Rajiv Chilaka	17
Marcus Raboy	16
Suhas Kadav	15
Jay Karas	15
Jay Chapman	12
Martin Scorsese	12
Steven Spielberg	11
Don Michael Paul	10
Shannon Hartman	9
Name: title, dtype:	int6

In [148]:

```
df_US.groupby(['cast','director'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[148]:

cast	director	
missing	missing	241
Fortune Feimster	missing	15
Rupa Bhimani	Rajiv Chilaka	15
Julie Tejwani	Rajiv Chilaka	15
Rajesh Kava	Rajiv Chilaka	15
Jigna Bhardwaj	Rajiv Chilaka	15
Vatsal Dubey	Rajiv Chilaka	14
Swapnil	Rajiv Chilaka	12
Mousam	Rajiv Chilaka	12
Vincent Tong	missing	11
Name: title, dtype: int64		

In [159]:

```
df_US.groupby(['cast','type'])['title'].nunique().sort_values(ascending = False)[1:11]
```

Out[159]:

cast	type	
missing	TV Show	239
Rupa Bhimani	Movie	23
Adam Sandler	Movie	20
Julie Tejwani	Movie	19
Rajesh Kava	Movie	17
Jigna Bhardwaj	Movie	16
Andrea Libman	Movie	15
Fred Tatasciore	Movie	15
Alfred Molina	Movie	15
Molly Shannon	Movie	14
Name: title, dtyp	e: int64	

In [127]:

Ananlysis for India

In [149]:

```
df_india.groupby(['cast','type'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[149]:

cast	type	
Anupam Kher	Movie	36
Om Puri	Movie	26
Shah Rukh Khan	Movie	25
Boman Irani	Movie	25
Paresh Rawal	Movie	25
Akshay Kumar	Movie	23
missing	Movie	20
Naseeruddin Shah	Movie	20
Kareena Kapoor	Movie	20
Amitabh Bachchan	Movie	20
Name: title, dtype	: int64	
Name: title, dtype	: int64	

In [150]:

```
df_india.groupby(['cast'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[150]:

cast	
missing	39
Anupam Kher	36
Om Puri	26
Paresh Rawal	25
Shah Rukh Khan	25
Boman Irani	25
Akshay Kumar	23
Naseeruddin Shah	20
Kareena Kapoor	20
Amitabh Bachchan	20
Name: title, dtype:	int64

In [151]:

```
df_india.groupby(['director'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[151]:

director	
missing	85
David Dhawan	9
Anurag Kashyap	7
Ram Gopal Varma	7
Sooraj R. Barjatya	6
Ashutosh Gowariker	6
Anees Bazmee	6
Imtiaz Ali	6
Rajkumar Santoshi	6
Priyadarshan	6
Name: title, dtype:	int64

In [152]:

```
df_india.groupby(['cast','director'])['title'].nunique().sort_values(ascending = False)[:10
```

Out[152]:

director	
missing	18
David Dhawan	6
Sooraj R. Barjatya	5
Rajiv Chilaka	4
Rajiv Chilaka	4
Sooraj R. Barjatya	4
Sooraj R. Barjatya	4
Priyadarshan	4
Hrishikesh Mukherjee	3
Rajiv Chilaka	3
/pe: int64	
	missing David Dhawan Sooraj R. Barjatya Rajiv Chilaka Rajiv Chilaka Sooraj R. Barjatya Sooraj R. Barjatya Priyadarshan Hrishikesh Mukherjee Rajiv Chilaka

In [132]:

```
df_india.groupby(['listed_in'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[132]:

```
listed in
 International Movies
                          826
Dramas
                          415
Comedies
                          271
                          247
Dramas
 Independent Movies
                          166
Action & Adventure
                          137
 Romantic Movies
                          120
Music & Musicals
                           96
 Thrillers
                           91
Comedies
                           52
Name: title, dtype: int64
```

In [133]:

```
# Analysis for UK
```

In [154]:

```
df_UK.groupby(['cast','type'])['title'].nunique().sort_values(ascending = False)[1:11]
```

Out[154]:

cast	type	
missing	TV Show	39
David Attenborough	TV Show	13
Michael Palin	Movie	9
John Cleese	Movie	9
Brendan Gleeson	Movie	8
Helena Bonham Carter	Movie	8
Terry Gilliam	Movie	7
Terry Jones	Movie	7
Eddie Marsan	Movie	7
Judi Dench	Movie	7
Name: title, dtype: in	it64	

In [155]:

```
df_UK.groupby(['director'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[155]:

67
4
4
3
3
3
3
3
3
3

In [156]:

```
df_UK.groupby(['cast','director'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[156]:

director	
missing	43
missing	13
missing	5
missing	5
missing	5
Alastair Fothergill	4
missing	4
missing	4
Vince Marcello	3
Jerry Rothwell	3
int64	
	missing missing missing missing missing Alastair Fothergill missing missing Vince Marcello Jerry Rothwell

```
In [157]:
```

```
df_UK.groupby(['cast'])['title'].nunique().sort_values(ascending = False)[:10]
```

Out[157]:

```
cast
missing
                         97
David Attenborough
                         17
Michael Palin
                         14
 Eric Idle
                         12
 Terry Jones
                         12
 John Cleese
                         12
 Terry Gilliam
                         11
 Helena Bonham Carter
 Jim Broadbent
 Brendan Gleeson
Name: title, dtype: int64
```

In []: