# **Exploratory Data Analytics on Netflix Data**

# **Load the Packages and Data**

```
In [1]:
         import pandas as pd
                                                   # for dataframe and manipulation
         import numpy as np
                                                   # for numerical computing
         import seaborn as sns
                                                   # for graphs and data visualization
         import matplotlib.pyplot as plt
         import plotly.graph_objects as go
In [2]: netflix = pd.read csv(r"C:\Users\tiwbrahm\Downloads\netflix.csv")
In [3]: |netflix.head(2)
Out[3]:
             show_id
                        type
                                 title
                                      director
                                                         country
                                                                  date_added release_year
                                 Dick
                                       Kirsten
                                                           United
                                                                   September
                                                                                             PG-
          0
                                                                                     2020
                                                                                                   9
                                                    NaN
                     Movie
                             Johnson
                                                           States
                                                                     25, 2021
                                                                                              13
                                      Johnson
                              Is Dead
                                                    Ama
                                                Qamata,
                                                   Khosi
                                                           South
                                                                   September
                                                                                             TV-
                              Blood &
                                         NaN
                                                 Ngema,
                                                                                     2021
                       Show
                               Water
                                                                     24, 2021
                                                                                             MA
                                                           Africa
                                                                                                  Sea
                                                    Gail
                                               Mabalane,
                                                Thaban...
In [4]: netflix.tail(2)
Out[4]:
                                   title director
                show_id
                           type
                                                      cast country date_added release_year rating c
                                                 Tim Allen,
                                                 Courteney
                                           Peter
                                                             United
                                                                     January 11,
                                                      Cox,
          8805
                   s8806 Movie
                                  Zoom
                                                                                       2006
                                                                                               PG
                                          Hewitt
                                                    Chevy
                                                             States
                                                                          2020
                                                    Chase,
                                                 Kate Ma...
                                                     Vicky
                                                  Kaushal,
                                                    Sarah-
                                          Mozez
                                                                       March 2,
          8806
                   s8807 Movie Zubaan
                                                      Jane
                                                              India
                                                                                       2015 TV-14
                                                                          2019
                                          Singh
                                                     Dias,
                                                  Raaghav
                                                  Chanan...
```

```
In [5]: netflix.shape
Out[5]: (8807, 12)
In [6]: netflix.size
Out[6]: 105684
In [7]: |netflix.columns
Out[7]: Index(['show_id', 'type', 'title', 'director', 'cast', 'country', 'date_adde
        d',
                'release_year', 'rating', 'duration', 'listed_in', 'description'],
              dtype='object')
In [8]: netflix.dtypes
Out[8]: show id
                         object
        type
                         object
        title
                         object
        director
                         object
        cast
                         object
        country
                         object
        date added
                         object
        release_year
                          int64
        rating
                         object
        duration
                         object
        listed_in
                         object
        description
                         object
        dtype: object
In [9]: netflix.info()
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 8807 entries, 0 to 8806
        Data columns (total 12 columns):
         #
             Column
                            Non-Null Count Dtype
         0
             show id
                            8807 non-null
                                            object
                                            object
                            8807 non-null
         1
             type
         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
                            8807 non-null
                                            int64
             release year
         8
             rating
                            8803 non-null
                                            object
         9
                                            object
             duration
                            8804 non-null
         10 listed in
                            8807 non-null
                                            object
             description
                            8807 non-null
                                            object
        dtypes: int64(1), object(11)
        memory usage: 825.8+ KB
```

In [10]: netflix.describe()

# Out[10]:

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

In [11]: netflix.describe(include='all')

# Out[11]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	dι
nt	8807	8807	8807	6173	7982	7976	8797	8807.000000	8803	
ıe	8807	2	8807	4528	7692	748	1767	NaN	17	
γp	<b>s</b> 1	Movie	Dick Johnson Is Dead	Rajiv Chilaka	David Attenborough	United States	January 1, 2020	NaN	TV- MA	ξ
þŧ	1	6131	1	19	19	2818	109	NaN	3207	
ın	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2014.180198	NaN	
td	NaN	NaN	NaN	NaN	NaN	NaN	NaN	8.819312	NaN	
in	NaN	NaN	NaN	NaN	NaN	NaN	NaN	1925.000000	NaN	
%	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2013.000000	NaN	
%	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2017.000000	NaN	
%	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2019.000000	NaN	
ìХ	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2021.000000	NaN	
4										<b>•</b>

```
In [12]: netflix.nunique()
Out[12]: show_id
                          8807
         type
                             2
                          8807
         title
         director
                          4528
                          7692
         cast
         country
                           748
         date_added
                          1767
         release_year
                            74
         rating
                            17
                           220
         duration
         listed_in
                           514
         description
                          8775
         dtype: int64
```

# **Data Cleaning (Handling missing & duplicate values)**

In [13]: # Find Missing Values
netflix.isnull()

Out[13]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	duratior
0	False	False	False	False	True	False	False	False	False	False
1	False	False	False	True	False	False	False	False	False	Fals€
2	False	False	False	False	False	True	False	False	False	Fals€
3	False	False	False	True	True	True	False	False	False	Fals€
4	False	False	False	True	False	False	False	False	False	False
8802	False	False	False	False	False	False	False	False	False	Fals€
8803	False	False	False	True	True	True	False	False	False	Fals€
8804	False	False	False	False	False	False	False	False	False	Fals€
8805	False	False	False	False	False	False	False	False	False	Fals€
8806	False	False	False	False	False	False	False	False	False	Fals€
8807 r	8807 rows × 12 columns									
4										•

```
In [14]: missing = netflix.isnull().sum() # Missing values
         missing
Out[14]: show_id
                             0
                             0
         type
         title
                             0
         director
                          2634
         cast
                           825
         country
                           831
         date_added
                            10
                             0
         release_year
                             4
         rating
         duration
                             3
         listed_in
                             0
         description
                             0
         dtype: int64
In [15]: missing1 = (netflix.isnull().sum()/len(netflix)*100) # Missing values in %
         missing1
Out[15]: show_id
                           0.000000
         type
                           0.000000
         title
                           0.000000
         director
                          29.908028
         cast
                           9.367549
         country
                           9.435676
         date_added
                           0.113546
         release_year
                           0.000000
                           0.045418
         rating
         duration
                           0.034064
         listed_in
                           0.000000
         description
                           0.000000
         dtype: float64
```

```
In [16]: # Missing Total with %
    Missed = pd.concat([missing,missing1],axis=1,keys=['Total','Missing%'])
    Missed
```

# Out[16]:

	Total	Missing%
show_id	0	0.000000
type	0	0.000000
title	0	0.000000
director	2634	29.908028
cast	825	9.367549
country	831	9.435676
date_added	10	0.113546
release_year	0	0.000000
rating	4	0.045418
duration	3	0.034064
listed_in	0	0.000000
description	0	0.000000

```
In [17]: # Heatmap to describe Null data in Netflix dataset
          sns.heatmap(netflix.isnull())
          plt.xticks(rotation=90)
Out[17]: (array([ 0.5, 1.5, 2.5, 3.5, 4.5, 5.5, 6.5, 7.5, 8.5, 9.5, 10.5,
                    11.5]),
            [Text(0.5, 0, 'show_id'),
            Text(1.5, 0, 'type'),
             Text(2.5, 0, 'title'),
            Text(3.5, 0, 'director'),
             Text(4.5, 0, 'cast'),
             Text(5.5, 0, 'country'),
             Text(6.5, 0, 'date_added'),
             Text(7.5, 0, 'release_year'),
             Text(8.5, 0, 'rating'),
             Text(9.5, 0, 'duration'),
             Text(10.5, 0, 'listed_in'),
             Text(11.5, 0, 'description')])
                                                                                    - 1.0
             339
             678 -
            1017
            1356
            1695
                                                                                    - 0.8
            2034
            2373
            2712
            3051
            3390
                                                                                   - 0.6
            3729
            4068
            4407
            4746
            5085
                                                                                     0.4
            5424
            5763
            6102
            6441
            6780
                                                                                     0.2
            7119
            7458
            7797
            8136
            8475
                                                                                    - 0.0
                         type
                                       cast
                                   director
                                                           rating
                                                                duration
                                                                    listed_in
                                            country
                                                 date_added
                                                      release_year
                                                                         description
```

- From the above output we can see that director,cast & country columns contains maximum null values.
- Filling missing (Null) values for director,cast & country as "Unknown" for the missing

..

```
In [18]: # making copy of dataset for changes
          netflix copy = netflix.copy()
          netflix_copy.head(2)
Out[18]:
             show_id
                       type
                               title
                                    director
                                                 cast country date_added release_year rating dur
                               Dick
                                     Kirsten
                                                        United
                                                               September
                                                                                       PG-
                                                                                2020
                                                                                             9
           0
                  s1 Movie Johnson
                                                 NaN
                                                                                        13
                                    Johnson
                                                        States
                                                                 25, 2021
                             Is Dead
                                                 Ama
                                              Qamata,
                                                Khosi
                                                        South
                                                               September
                                                                                        TV-
                             Blood &
                                                                                2021
                                       NaN
                                               Ngema,
                      Show
                              Water
                                                                 24, 2021
                                                        Africa
                                                                                        MA
                                                                                           Sea
                                                 Gail
                                             Mabalane,
                                             Thaban...
In [19]: |netflix_copy['director']
Out[19]: 0
                   Kirsten Johnson
          1
                                NaN
          2
                   Julien Leclercq
          3
                                NaN
          4
                                NaN
                         . . .
          8802
                     David Fincher
          8803
                                NaN
          8804
                   Ruben Fleischer
          8805
                      Peter Hewitt
          8806
                       Mozez Singh
          Name: director, Length: 8807, dtype: object
In [20]: netflix copy['director'].fillna('Unknown',inplace=True)
In [21]: |netflix_copy['cast']
Out[21]: 0
          1
                   Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...
          2
                   Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...
          3
                   Mayur More, Jitendra Kumar, Ranjan Raj, Alam K...
          4
          8802
                   Mark Ruffalo, Jake Gyllenhaal, Robert Downey J...
          8803
                                                                     NaN
          8804
                   Jesse Eisenberg, Woody Harrelson, Emma Stone, ...
                   Tim Allen, Courteney Cox, Chevy Chase, Kate Ma...
          8805
          8806
                   Vicky Kaushal, Sarah-Jane Dias, Raaghav Chanan...
          Name: cast, Length: 8807, dtype: object
```

```
In [22]: netflix copy['cast'].fillna('Unknown',inplace=True)
 In [23]: netflix copy['country']
 Out[23]: 0
                    United States
           1
                      South Africa
           2
                                NaN
           3
                                NaN
           4
                             India
           8802
                    United States
           8803
                                NaN
           8804
                    United States
           8805
                    United States
           8806
                             India
           Name: country, Length: 8807, dtype: object
In [122]: netflix_copy['country'].fillna('Unknown',inplace=True)
In [123]: netflix_copy.head(2)
Out[123]:
               show_id
                         type
                                  title
                                        director
                                                    cast country date_added release_year rating du
                                 Dick
                                         Kirsten
                                                           United
                                                                                            PG-
                                                 Unknown
            0
                    s1 Movie Johnson
                                                                   2021-09-25
                                                                                    2020
                                                           States
                                                                                             13
                                       Johnson
                               Is Dead
                                                    Ama
                                                 Qamata,
                                                    Khosi
                               Blood &
                                                            South
                                                                                            TV-
                                       Unknown
                                                  Ngema,
                                                                   2021-09-24
                                                                                    2021
                        Show
                                Water
                                                            Africa
                                                                                            MA
                                                                                                Sε
                                                     Gail
                                                Mabalane,
                                                 Thaban...
```

- There are 3 more fields with missing values ('date\_added', 'rating', 'duration').
- Since the we have missing values less than 1%, we can remove these records for the analysis.

```
In [25]: netflix_copy.dropna(subset=['date_added','rating','duration'], inplace=True)
```

In [26]: netflix\_copy.head()

Out[26]:

Out[26]:	sh	ow_id	type	title	director	cast	country	date_added	release_year	rating
	0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	Unknown	United States	September 25, 2021	2020	PG- 13
	1	s2	TV Show	Blood & Water	Unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA
	2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	Unknown	September 24, 2021	2021	TV- MA
	3	s4	TV Show	Jailbirds New Orleans	Unknown	Unknown	Unknown	September 24, 2021	2021	TV- MA
	4	s5	TV Show	Kota Factory	Unknown	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	September 24, 2021	2021	TV- MA
	4									•
In [27]:	# Han	dLing	with	duplicate	rows					
In [28]:	netfl	ix_co	py[net	flix_copy	.duplica	ted()]	# To sh	ow duplica	te rows	
Out[28]:	sho	w id	tvne ti	tle director	cast co	untry date	added re	elease vear	rating duration	n listed
	1	<u>-</u>	Spe ti	ao anector		and y date		yeai 1	ading duration	)
In [29]:	netfl	ix_co	py.dup	licated()	.sum()	# Count	of dupli	cate rows		
Out[29]:							•			

• No duplicate rows are present in this dataset.

```
In [30]: netflix_copy.shape # Size after cleaning
Out[30]: (8790, 12)
```

# **Exploratory Data Analysis**

```
In [31]: netflix_copy.type.unique()
Out[31]: array(['Movie', 'TV Show'], dtype=object)
```

• We can see that netflix have 69% movies while 30% TV Shows

```
In [131]: netflix_movies = netflix_copy[netflix_copy['type'] == 'Movie'].copy()
   netflix_shows = netflix_copy[netflix_copy['type'] == 'TV Show'].copy()
```

In [132]: netflix\_movies.head(2)

#### Out[132]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	(
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	Unknown	United States	2021-09-25	2020	PG- 13	_
6	s7	Movie	My Little Pony: A New Generation	Robert Cullen, José Luis Ucha	Vanessa Hudgens, Kimiko Glenn, James Marsden,	Unknown	2021-09-24	2021	PG	
4									•	

In [38]: netflix\_shows.head(2)

Out[38]:

	show_id	type	title	director	cast	country	date_added	release_year	rating
1	s2	TV Show	Blood & Water	Unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	Unknown	September 24, 2021	2021	TV- MA
4									•

# Clean duration field in movies dataframe

```
In [39]: netflix_movies['duration'] = netflix_movies.duration.str.replace(' min','').a
In [40]: netflix_shows.rename(columns={'duration':'season'},inplace=True)
```

localhost:8888/notebooks/Netflix\_Case\_Study.ipynb#THANK-YOU!!

In [41]: netflix\_shows.head(5)

# Out[41]:

	show_id	type	title	director	cast	country	date_added	release_year	rating
1	s2	TV Show	Blood & Water	Unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	Unknown	September 24, 2021	2021	TV- MA
3	s4	TV Show	Jailbirds New Orleans	Unknown	Unknown	Unknown	September 24, 2021	2021	TV- MA
4	<b>s</b> 5	TV Show	Kota Factory	Unknown	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	September 24, 2021	2021	TV- MA
5	s6	TV Show	Midnight Mass	Mike Flanagan	Kate Siegel, Zach Gilford, Hamish Linklater, H	Unknown	September 24, 2021	2021	TV- MA
4									•
	67.								

In [42]: netflix\_shows["season"] = netflix\_shows.season.str.replace(" Seasons",'')
netflix\_shows["season"] = netflix\_shows.season.str.replace(" Season",'').asty

In [43]: netflix\_shows.head()

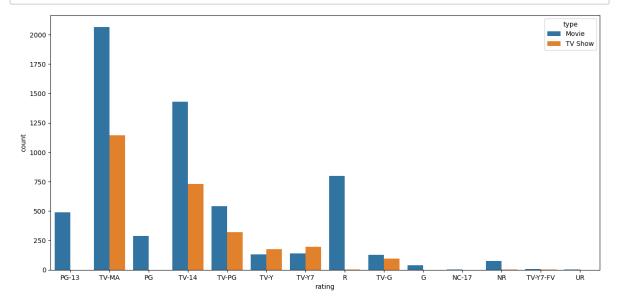
Out[43]:

	show_id	type	title	director	cast	country	date_added	release_year	rating s
1	s2	TV Show	Blood & Water	Unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA
2	s s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	Unknown	September 24, 2021	2021	TV- MA
3	s s4	TV Show	Jailbirds New Orleans	Unknown	Unknown	Unknown	September 24, 2021	2021	TV- MA
4	. s5	TV Show	Kota Factory	Unknown	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	September 24, 2021	2021	TV- MA
5	s s6	TV Show	Midnight Mass	Mike Flanagan	Kate Siegel, Zach Gilford, Hamish Linklater, H	Unknown	September 24, 2021	2021	TV- MA
	4								•

# 1. Ratings of Movies and Seasons

```
In [44]: netflix_copy.rating.unique()
```

In [45]: plt.figure(figsize=(15,7))
 sns.countplot(netflix\_copy,x=netflix\_copy['rating'],hue=netflix\_copy['type'])
 plt.show()



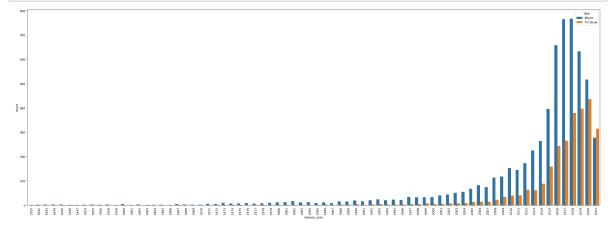
#### Observation:

- Maximum count of ratings included TV-MA (Mature Audiences) and TV-14 (Parents strongly cautioned) for both Movies and TV shows
- 17 types of ratings on netflix

# 2. Movies and TV shows released in every years

```
In [46]: #No. of movies released every year
         netflix_copy.groupby(['release_year'])['release_year'].count().sort_values(as
Out[46]: release_year
         2018
                  1146
         2019
                  1030
         2017
                  1030
         2020
                   953
         2016
                   901
         1959
                     1
         1961
                     1
                     1
         1947
         1966
                     1
         1925
         Name: release_year, Length: 74, dtype: int64
```

```
In [130]: plt.figure(figsize=(35,12))
    sns.countplot(netflix_copy,x = netflix_copy.release_year,hue=netflix_copy.type
    plt.xticks(rotation=90)
    plt.show()
```



#### Observation:

- Netflix touched its peak for making movies in 2018 and TV shows in 2020
- From the above we can see that with passing years more movies are being made year by year
- The above data shows that there is a sudden increase in the creation of movies in year 2016 as compared to year 2015

#### 3. Most watched shows on the Netflix?

In [53]: netflix\_copy.type.value\_counts().to\_frame('Value\_count')

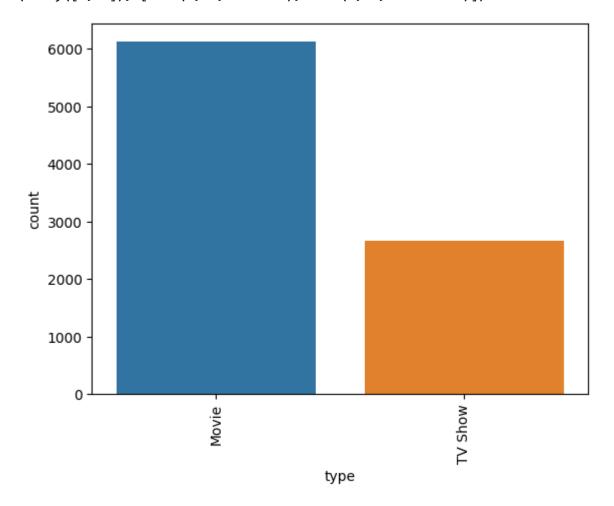
## Out[53]:

## Value\_count

type	
Movie	6126
TV Show	2664

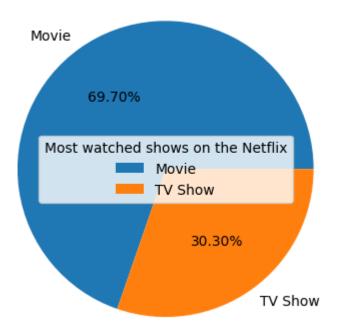
```
In [54]: sns.countplot(x=netflix_copy['type'])
plt.xticks(rotation=90)
```

Out[54]: (array([0, 1]), [Text(0, 0, 'Movie'), Text(1, 0, 'TV Show')])



```
In [55]: # Pie chart to show value in % for most watched
    type_show = ['Movie','TV Show']
    Value_count = [6126,2663]
    plt.pie(Value_count,labels=type_show,autopct="%2.2f%%")
    plt.legend(title='Most watched shows on the Netflix')
```

Out[55]: <matplotlib.legend.Legend at 0x1700d5e8130>



• Observation : Audience likes to watched mostly movies(69.70%) over TV shows(30.30%)

## 4 Which has the highest rating Tv show or Movies?

In [56]:	net	netflix_copy.head(2)												
Out[56]:		show_id	type	title	director	cast	country	date_added	release_year	rating	du			
	0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	Unknown	United States	September 25, 2021	2020	PG- 13	(			
	1	s2	TV Show	Blood & Water	Unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA	S€			
	4										•			

```
In [57]: netflix.groupby("type")["rating"].agg(pd.Series.mode)
Out[57]: type
          Movie
                     TV-MA
          TV Show
                     TV-MA
          Name: rating, dtype: object
         new genre = netflix copy['listed in'].str.split(",",n = 2)
In [58]:
          new_genre
Out[58]: 0
                                                       [Documentaries]
          1
                  [International TV Shows, TV Dramas,
                                                          TV Myste...
          2
                  [Crime TV Shows,
                                     International TV Shows, TV ...
          3
                                            [Docuseries, Reality TV]
          4
                  [International TV Shows,
                                              Romantic TV Shows,
          8802
                                  [Cult Movies,
                                                 Dramas, Thrillers]
                          [Kids' TV, Korean TV Shows, TV Comedies]
          8803
          8804
                                           [Comedies, Horror Movies]
                               [Children & Family Movies, Comedies]
          8805
                            International Movies, Music & Music...
          8806
          Name: listed in, Length: 8790, dtype: object
         netflix_copy['Genre 1'] = new_genre.str.get(0)
In [59]:
          netflix_copy['Genre 2'] = new_genre.str.get(1)
          netflix_copy['Genre 3'] = new_genre.str.get(2)
          netflix_copy.head(2)
Out[59]:
                                                 cast country date_added release_year rating du
             show_id
                               title
                                    director
                               Dick
                                                               September
                                                                                      PG-
                                     Kirsten
                                                       United
          0
                  s1 Movie
                                                                               2020
                           Johnson
                                             Unknown
                                    Johnson
                                                       States
                                                                25, 2021
                                                                                       13
                            Is Dead
                                                 Ama
                                              Qamata,
                                                Khosi
                                                                                      TV-
                                                       South
                                                              September
                            Blood &
                                                                               2021
                                   Unknown
                                              Ngema,
                      Show
                             Water
                                                                24, 2021
                                                                                      MA Se
                                                        Africa
                                                 Gail
                                            Mabalane,
                                             Thaban...
In [60]: netflix copy['Genre 1'].describe(include=all)
Out[60]: count
                       8790
          unique
                         36
          top
                    Dramas
                       1599
          freq
          Name: Genre 1, dtype: object
```

(

```
In [61]: netflix copy['Genre 2'].describe(include=all)
Out[61]: count
                                          6778
           unique
                                            37
                       International Movies
           top
           freq
                                          1722
           Name: Genre 2, dtype: object
In [62]: netflix_copy['Genre 3'].describe(include=all)
Out[62]: count
                                          3726
           unique
                                            33
           top
                       International Movies
           freq
           Name: Genre 3, dtype: object
In [63]: netflix_copy.drop('listed_in',axis = 1,inplace = True)
           netflix copy.head(2)
Out[63]:
              title
                                 cast country date_added release_year rating duration description
                    director
                                                                                            As her
              Dick
                                                                                            father
                                                September
                                                                          PG-
                     Kirsten
                                        United
          Johnson
                             Unknown
                                                                  2020
                                                                                90 min
                                                                                          nears the
                                                  25, 2021
                                                                           13
                    Johnson
                                        States
                                                                                          end of his
           Is Dead
                                                                                        life, filmm...
                                 Ama
                                                                                             After
                              Qamata,
                                                                                           crossing
                                Khosi
           Blood &
                                         South
                                                September
                                                                          TV-
                                                                                     2
                                                                                         paths at a
                   Unknown
                                                                  2021
                               Ngema,
            Water
                                         Africa
                                                  24, 2021
                                                                          MA
                                                                               Seasons
                                                                                           party, a
                                  Gail
                                                                                        Cape Town
                            Mabalane,
                                                                                               t...
                             Thaban...
In [64]: netflix_copy.duplicated().sum()
Out[64]: 0
```

In [65]: netflix\_copy.groupby(['Genre 1'])['release\_year'].count().sort\_values(ascendi) Out[65]: Genre 1 Dramas 1599 Comedies 1210 Action & Adventure 859 829 Documentaries International TV Shows 773 Children & Family Movies 605 Crime TV Shows 399 Kids' TV 385 Stand-Up Comedy 334 Horror Movies 275 British TV Shows 252 Docuseries 220 Anime Series 174 International Movies 128 Reality TV 120 TV Comedies 119 Classic Movies 80 TV Dramas 67 Thrillers 65 Movies 53 TV Action & Adventure 39 Stand-Up Comedy & Talk Shows 34 Romantic TV Shows 32 Anime Features 21 Classic & Cult TV 20 Independent Movies 20 Music & Musicals 18 TV Shows 16 Sci-Fi & Fantasy 13 Cult Movies 12 TV Horror 11 Romantic Movies 3 2 Spanish-Language TV Shows Sports Movies 1 TV Sci-Fi & Fantasy 1 LGBTQ Movies

Name: release year, dtype: int64

In [66]: netflix\_copy.groupby(['Genre 2'])['release\_year'].count().sort\_values(ascendi) Out[66]: Genre 2 International Movies 1722 758 Dramas Independent Movies 576 475 International TV Shows Comedies 452 TV Dramas 320 TV Comedies 263 Romantic TV Shows 239 Thrillers 232 Romantic Movies 171 Docuseries 153 Music & Musicals 148 Korean TV Shows 131 Sci-Fi & Fantasy 112 Sports Movies 100 95 Reality TV TV Action & Adventure 83 Horror Movies 75 70 Crime TV Shows 65 Spanish-Language TV Shows Kids' TV 62 54 Faith & Spirituality Anime Features 50 45 Cult Movies 45 Science & Nature TV 45 LGBTQ Movies Documentaries 39 Children & Family Movies 32 Classic Movies 30 TV Horror 30 TV Mysteries 22 TV Sci-Fi & Fantasy 21 Teen TV Shows 21 Stand-Up Comedy & Talk Shows 16 TV Thrillers 11 Stand-Up Comedy 9 Classic & Cult TV 6 Name: release year, dtype: int64

```
In [67]: netflix_copy.groupby(['Genre 3'])['release_year'].count().sort_values(ascendi)
Out[67]: Genre 3
                                            902
           International Movies
           Romantic Movies
                                            442
           TV Dramas
                                            375
           Thrillers
                                            280
           Music & Musicals
                                            209
           TV Comedies
                                            191
           Independent Movies
                                            160
           Sports Movies
                                            118
           Sci-Fi & Fantasy
                                            118
           Spanish-Language TV Shows
                                            106
           International TV Shows
                                            101
           Romantic TV Shows
                                             99
           TV Mysteries
                                             76
           Dramas
                                             69
           TV Sci-Fi & Fantasy
                                             61
           LGBTQ Movies
                                             56
           Teen TV Shows
                                             48
           Science & Nature TV
                                             47
           TV Thrillers
                                             46
           TV Action & Adventure
                                             45
           Reality TV
                                             40
           TV Horror
                                             34
           Docuseries
                                             21
           Korean TV Shows
                                             20
           Cult Movies
                                             14
           Comedies
                                             12
           Faith & Spirituality
                                             11
           Horror Movies
                                              7
           Classic Movies
                                              6
           Stand-Up Comedy & Talk Shows
                                              6
           Children & Family Movies
                                              4
           Kids' TV
                                              1
           Documentaries
                                              1
         Name: release_year, dtype: int64
```

#### 5. Best Month for releasing content?

```
In [68]: netflix_copy.head(2)
```

#### Out[68]:

	title	director	cast	country	date_added	release_year	rating	duration	description	
	Dick Johnson Is Dead	Kirsten Johnson	Unknown	United States	September 25, 2021	2020	PG- 13	90 min	As her father nears the end of his life, filmm	D
Blood & Water		Unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA	2 Seasons	After crossing paths at a party, a Cape Town t	
	<b>∢</b>								)	

```
In [102]: netflix_copy.dtypes
```

```
Out[102]: show id
                                        object
                                        object
           type
           title
                                        object
           director
                                        object
           cast
                                        object
                                        object
           country
           date added
                                datetime64[ns]
           release_year
                                         int64
           rating
                                        object
           duration
                                        object
           description
                                        object
           Genre 1
                                        object
           Genre 2
                                        object
           Genre 3
                                        object
           month added
                                         int32
           month name added
                                        object
```

```
In [104]: netflix_tv = netflix_copy[netflix_copy["type"] == "TV Show"]
netflix_movies = netflix_copy[netflix_copy["type"] == "Movie"]
```

int32

year added

dtype: object

In [116]: netflix\_copy.head(2)

# Out[116]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	du
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	Unknown	United States	2021-09-25	2020	PG- 13	(
1	s2	TV Show	Blood & Water	Unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	2021-09-24	2021	TV- MA	Se
4										•

In [117]: netflix\_copy.month\_name\_added.value\_counts().to\_frame('Value\_count')

# Out[117]:

# Value\_count

month_name_added	
July	827
December	812
September	769
April	763
October	760
August	754
March	741
January	737
June	728
November	705
Мау	632
February	562

```
Netflix_Case_Study - Jupyter Notebook
In [119]: | sns.countplot(x=netflix_copy['month_name_added'],orient='v')
           plt.xticks(rotation=90)
Out[119]: (array([ 0, 1, 2, 3, 4,
                                         5,
                                             6, 7, 8, 9, 10, 11]),
            [Text(0, 0, 'September'),
            Text(1, 0, 'August'),
             Text(2, 0, 'July'),
             Text(3, 0, 'June'),
             Text(4, 0, 'May'),
             Text(5, 0, 'April'),
             Text(6, 0, 'March'),
             Text(7, 0, 'February'),
             Text(8, 0, 'January'),
             Text(9, 0, 'December'),
             Text(10, 0, 'November'),
             Text(11, 0, 'October')])
               800
               700
               600
               500
            count
               400
               300
               200
```

June

Мау

April

July

March

month\_name\_added

February

January

December

November

October

100

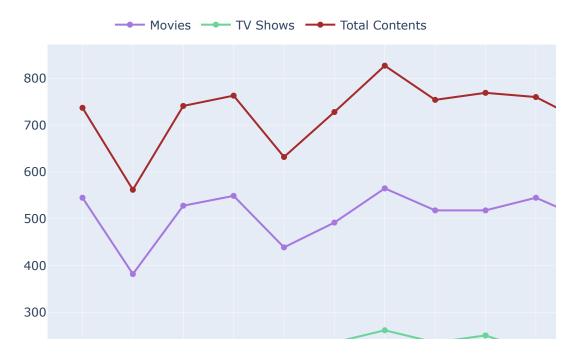
0

September

August

```
In [106]: netflix content = netflix copy[['month added','month name added']].value coun
              0 : 'count'}).sort_values('month_added').drop('month_added',axis=1)
          netflix content['percent'] = netflix content['count'].apply(lambda x : 100*x/
          netflix_tv2 = netflix_tv[['month_added','month_name_added']].value_counts().r
              0 : 'count'}).sort_values('month_added').drop('month_added',axis=1)
          netflix tv2['percent'] = netflix tv2['count'].apply(lambda x : 100*x/sum(netflix)
          netflix_movies2 = netflix_movies[['month_added', 'month_name_added']].value_col
              0 : 'count'}).sort_values('month_added').drop('month_added',axis=1)
          netflix_movies2['percent'] = netflix_movies2['count'].apply(lambda x : 100*x/
          t1 = go.Scatter(x=netflix movies2['month name added'], y=netflix movies2["cou
          t2 = go.Scatter(x=netflix_tv2['month_name_added'], y=netflix_tv2["count"], na
          t3 = go.Scatter(x=netflix_content['month_name_added'], y=netflix_content["cou
          data = [t1, t2, t3]
          layout = go.Layout(title="Content added over the years", legend=dict(x=0.1, y
          fig = go.Figure(data, layout=layout)
          fig.show()
```

# Content added over the years



## Observation:

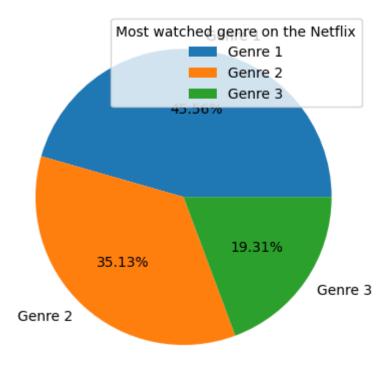
- July has maximum numbers of movies release. Hence July is the best month for releasing content.
- The growth in contents are higher in the first three months and the last three months of the year.
- Least number of contents are added in the month of February.

# 6. Highest watched genres on Netflix?

```
In [69]: netflix copy.head(2)
Out[69]:
                         title
                              director
                                           cast country date_added release_year rating duration d
         w_id
                type
                        Dick
                                Kirsten
                                                  United
                                                          September
                                                                                   PG-
           s1 Movie
                     Johnson
                                        Unknown
                                                                           2020
                                                                                         90 min
                               Johnson
                                                  States
                                                            25, 2021
                                                                                    13
                      Is Dead
                                           Ama
                                        Qamata,
                                           Khosi
                                                                                   TV-
                                                   South
                                                          September
                                                                                             2
                      Blood &
                                                                           2021
           s2
                              Unknown
                                         Ngema,
                                                            24, 2021
               Show
                       Water
                                                   Africa
                                                                                   MA
                                                                                       Seasons
                                            Gail
                                       Mabalane,
                                        Thaban...
In [70]: netflix_copy['Genre 1'].describe(include=all)
Out[70]: count
                        8790
          unique
                          36
          top
                     Dramas
          freq
                        1599
          Name: Genre 1, dtype: object
In [71]: netflix_copy['Genre 2'].describe(include=all)
Out[71]: count
                                         6778
          unique
                                           37
          top
                      International Movies
                                         1722
          freq
          Name: Genre 2, dtype: object
In [72]: netflix copy['Genre 3'].describe(include=all)
Out[72]: count
                                         3726
          unique
                                           33
          top
                      International Movies
                                          902
          Name: Genre 3, dtype: object
```

```
In [113]: # Showing most watched genre on Pie Chart
genre_types = ['Genre 1','Genre 2','Genre 3']

Value_count = [8790,6778,3726]
plt.pie(Value_count, labels = genre_types, autopct="%2.2f%%")
plt.legend(title='Most watched genre on the Netflix')
plt.show()
```



• Obeservation: Above Pi-chart Shows that Genre1 has watched maximum times.

## 7. Checking the time it took for movies to appear on netflix after release?

In [107]: netflix\_copy.head(2)

# Out[107]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	du
(	) s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	Unknown	United States	2021-09-25	2020	PG- 13	,
,	l s2	TV Show	Blood & Water	Unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	2021-09-24	2021	TV- MA	Se
4										•

In [108]: netflix\_copy[['release\_year','year\_added']]

# Out[108]:

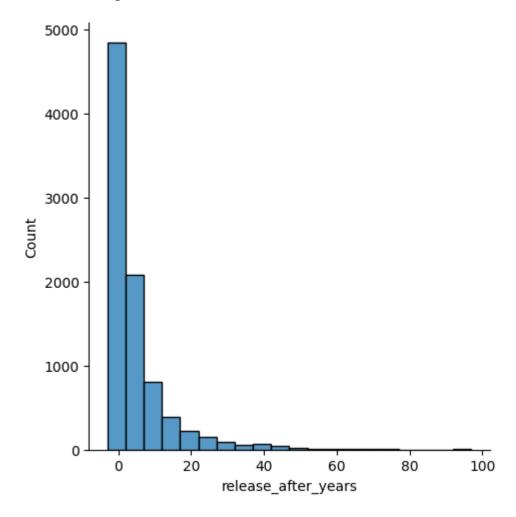
	release_year	year_added
0	2020	2021
1	2021	2021
2	2021	2021
3	2021	2021
4	2021	2021
8802	2007	2019
8803	2018	2019
8804	2009	2019
8805	2006	2020
8806	2015	2019

8790 rows × 2 columns

In [110]: netflix\_copy['release\_after\_years'] = netflix\_copy.year\_added - netflix\_copy.

In [112]: #Showing displot chart for time it took for movies to get publish on netflix of
sns.displot(netflix\_copy, x="release\_after\_years", binwidth=5)

Out[112]: <seaborn.axisgrid.FacetGrid at 0x170119baf80>



8 Show id and director for 'Sex Education'?



#### Obeservation:

• For "Sex Education" the show id is s33 and No director.

## 9. All the movies that were released in year 2004?

```
netflix copy.head(2)
Out[77]:
                show_id
                                     title
                                           director
                                                          cast country date_added release_year rating du
                           type
                                    Dick
                                                                          September
                                            Kirsten
                                                                 United
                                                                                                      PG-
             0
                                                     Unknown
                                                                                             2020
                                                                                                             (
                         Movie
                                 Johnson
                                           Johnson
                                                                 States
                                                                            25, 2021
                                                                                                       13
                                 Is Dead
                                                          Ama
                                                      Qamata,
                                                         Khosi
                                                                                                      TV-
                                 Blood &
                                                                  South
                                                                          September
                                          Unknown
                                                       Ngema,
                                                                                             2021
                          Show
                                   Water
                                                                  Africa
                                                                            24, 2021
                                                                                                      MA Se
                                                          Gail
                                                    Mabalane,
                                                     Thaban...
           netflix[(netflix['type'] == 'Movie' ) & (netflix['release_year'] == 2004)]
In [78]:
                      SO4OZ IVIOVIC
                                                                  Eddie Deezen,
                                       Express
                                                     Zemeckis
                                                                                    States
                                                                                                  2021
                                                                        Nona...
                                                                  Kang-ho Song,
                                          The
                                                                So-ri Moon, Jae-
                                                                                     South
                                                                                             October 1,
             8463
                     s8464
                            Movie
                                    President's
                                                Chan-sang Lim
                                                                      eung Lee,
                                                                                     Korea
                                                                                                  2017
                                        Barber
                                                                       Yeong-...
                                                                                    United
                                                                Julia Stiles, Luke
                                    The Prince
                                                       Martha
                                                                                    States,
                                                                                             October 1,
             8465
                     s8466 Movie
                                                                Mably, Ben Miller,
                                         & Me
                                                      Coolidge
                                                                                    Czech
                                                                                                  2020
                                                                     Miranda ...
                                                                                  Republic
                                    Tremors 4:
                                                                  Michael Gross,
                                                                                    United
                                                                                              January 1,
                                          The
             8624
                                                   S.S. Wilson
                     s8625 Movie
                                                                  Sara Botsford,
                                                                                    States
                                                                                                  2020
                                       Legend
                                                                Billy Drago, Bre ...
                                        Begins
                                                                Yılmaz Erdoğan,
                                      Vizontele
                                                       Yılmaz
                                                                                              March 10,
             8682
                     s8683 Movie
                                                                Tarık Akan, Altan
                                                                                    Turkey
                                        Tuuba
                                                      Erdoğan
                                                                                                  2017
In [79]: netflix[(netflix['type'] == 'Movie' ) & (netflix['release year'] == 2004)].sh
Out[79]: (55, 12)
```

# Obeservation :

There are 55 movies released in year 2004.

#### 10. Only the title of all TV shows that were released in United States only.

```
In [80]: netflix copy.head(2)
Out[80]:
                                title
              show_id
                                      director
                                                   cast country date_added release_year rating du
                       type
                                Dick
                                       Kirsten
                                                         United
                                                                 September
                                                                                          PG-
           0
                             Johnson
                                               Unknown
                                                                                  2020
                                                                                                (
                      Movie
                                      Johnson
                                                          States
                                                                   25, 2021
                                                                                           13
                             Is Dead
                                                   Ama
                                                Qamata,
                                                  Khosi
                                                          South
                                                                 September
                                                                                          TV-
                             Blood &
                                                                                  2021
                                     Unknown
                                                Ngema,
                                                                   24, 2021
                       Show
                               Water
                                                          Africa
                                                                                          MA Se
                                                   Gail
                                              Mabalane,
                                               Thaban...
In [81]: netflix_copy[(netflix_copy['type']=='TV Show') & (netflix_copy['country']=='U
Out[81]: 15
                                           Dear White People
          40
                   He-Man and the Masters of the Universe
          55
                                                    Nailed It
          67
                                           Saved by the Bell
          82
                                                      Lucifer
          8710
                                                        Weeds
          8726
                                       When Calls the Heart
          8747
                                                   Winsanity
          8755
                                          Women Behind Bars
          8780
                                                Yo-Kai Watch
          Name: title, Length: 754, dtype: object
In [82]: netflix_copy[(netflix_copy['type']=='TV Show') & (netflix_copy['country']=='U
Out[82]: (754,)
```

#### Obeservation:

There are 754 TV shows that were released in United States only.

# 11. How many Movies/TV Shows, 'Salman Khan' was cast??

In [83]: netflix\_copy.head(2) Out[83]: title show\_id director cast country date\_added release\_year rating du type Dick September Kirsten United PG-0 Johnson Unknown 2020 ( Movie Johnson States 25, 2021 13 Is Dead Ama Qamata, Khosi South September TV-Blood & 2021 Unknown Ngema, Show Water Africa 24, 2021 MA Sε Gail Mabalane, Thaban... netflix\_copy[netflix\_copy['cast'].str.contains('Salman Khan')] In [84]: ıvıaıne Sooraj K. January 1, 7387 Bhagyashree, 198 s7388 Movie India Pyar Kiya 2018 Barjatya Alok Nath, Rajeev Ve... Rajpal Yadav, Mujhse David Amrish Puri, December 7524 s7525 Movie Shaadi India 200 Dhawan Kader Khan, 31, 2019 Karogi Shashi ... Anil Kapoor, Salman Khan, March 1, Anees 7590 200 s7591 Movie No Entry India 2018 Bazmee Fardeen Khan, Bipash... Salman Khan, Asin, Paresh October 22, Anees 7837 s7838 Movie India 201 Ready 2017 Bazmee Rawal, Mahesh Manira In [85]: netflix copy[netflix copy['cast'].str.contains('Salman Khan')].shape Out[85]: (20, 14)

Obeservation:

• There are 20 movies where case is Salman Khan.

# 12. How many movies got the "TV-14" rating in the India??

In [86]: netflix\_copy.head(2)

Out[86]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	du
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	Unknown	United States	September 25, 2021	2020	PG- 13	(
1	s2	TV Show	Blood & Water	Unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA	S€
4										•

# Out[87]:

	show_id	type	title	director	cast	country	date_added	release_year	ra
24	s25	Movie	Jeans	S. Shankar	Prashanth, Aishwarya Rai Bachchan, Sri Lakshmi	India	September 21, 2021	1998	T
105	s106	Movie	Angamaly Diaries	Lijo Jose Pellissery	Antony Varghese, Reshma Rajan, Binny Rinky Ben	India	September 5, 2021	2017	Т
114	s115	Movie	Anjaam	Rahul Rawail	Madhuri Dixit, Shah Rukh Khan, Tinnu Anand, Jo	India	September 2, 2021	1994	T
118	s119	Movie	Gurgaon	Shanker Raman	Akshay Oberoi, Pankaj Tripathi, Ragini Khanna,	India	September 2, 2021	2017	Т
126	s127	Movie	Shikara	Vidhu Vinod Chopra	Aadil Khan, Sadia Khateeb, Zain Khan Durrani,	India	September 2, 2021	2020	Т
8770	s8771	Movie	Yaadein	Subhash Ghai	Jackie Shroff, Hrithik Roshan, Kareena Kapoor,	India	March 1, 2018	2001	Т
8771	s8772	Movie	Yaara O Dildaara	Ksshitij Chaudhary	Harbhajan Mann, Tulip Joshi, Kabir Bedi, Gulza	India	November 1, 2017	2011	Т
8772	s8773	Movie	Yamla Pagla Deewana 2	Sangeeth Sivan	Dharmendra, Sunny Deol, Bobby Deol, Neha Sharm	India	May 1, 2017	2013	Т
8799	s8800	Movie	Zenda	Avadhoot Gupte	Santosh Juvekar, Siddharth Chandekar, Sachit P	India	February 15, 2018	2009	Т
8806	s8807	Movie	Zubaan	Mozez Singh	Vicky Kaushal, Sarah-Jane Dias, Raaghav Chanan	India	March 2, 2019	2015	Т

526 rows × 14 columns

#### Observation:

• 526 movies got the "TV-14" rating in India.

# **Business Insights:**

- 1. From the above output we can see that director,cast & country columns contains maximum null values. Filling missing (Null) values for director,cast & country as "Unknown" for the missing directors.
- 2. We can see that netflix have 69% movies while 30% TV Shows
- 3. Maximum count of ratings included TV-MA (Mature Audiences) and TV-14 (Parents strongly cautioned) for both Movies and TV shows 17 types of ratings on netflix
- 4. Netflix touched its peak for making movies in 2018 and TV shows in 2020 From the above we can see that with passing years more movies are being made year by year The above data shows that there is a sudden increase in the creation of movies in year 2016 as compared to year 2015
- 5. Audience likes to watched mostly movies(96.88%) over TV shows(3.12%)
- 6. July has maximum numbers of movies release. Hence July is the best month for releasing content. The growth in contents are higher in the first three months and the last three months of the year. Least number of contents are added in the month of February.
- 7. Genre1 has been watched maximum times.
- 8. For "Sex Education" the show id is s33 and No director.
- 9. There are 55 movies released in year 2004.
- 10. There are 754 TV shows that were released in United States only.
- 11. There are 20 movies where case is Salman Khan.
- 12. 526 movies got the "TV-14" rating in India.

# **Recommendations:**

- Considering that Netflix has a higher focus on movies than TV shows, it could be beneficial for Netflix to continue investing in movie production. This can involve acquiring more movie titles, producing original movies, and partnering with renowned filmmakers and production companies to strengthen their movie catalog.
- 2. Given that TV-MA and TV-14 ratings are popular among Netflix viewers, it would be advantageous for Netflix to continue offering a diverse range of content targeted towards mature audiences. This can involve acquiring or producing more content in these rating

- categories to cater to the preferences of their subscribers.
- 3. Netflix can capitalize on the increasing trend of movie production by actively scouting for new and engaging movie projects. This can involve collaborations with talented directors, screenwriters, and actors to create high-quality movies that resonate with global audiences.
- 4. While movies are more popular among the audience, Netflix should not neglect TV shows entirely. They can consider strategic investments in original TV show productions to cater to the segment of their subscribers who enjoy TV series. This can involve partnering with popular showrunners and creators to develop compelling and binge-worthy TV content.
- 5. Based on the data showing the higher number of movie releases in July and the growth pattern in content additions, Netflix can prioritize the release of major movies and content expansions during the first three months and the last three months of the year. This can help maximize viewership and subscriber engagement during these periods.
- 6. Netflix can analyze the data further to identify the most-watched genres (Genre1) and leverage this information to curate personalized recommendations for their subscribers. By understanding the viewing preferences of their audience, Netflix can enhance the user experience by suggesting relevant content from the popular genres.
- 7. It would be beneficial for Netflix to provide complete and accurate metadata for all their content, including the show "Sex Education." Having accurate show IDs and director information helps improve the overall browsing experience for users and ensures consistent and comprehensive content information.
- 8. Considering the number of movies released in 2004 (55), Netflix can explore highlighting classic and noteworthy movies from that year to attract cinephiles and those interested in retro content. Creating curated collections or featuring a "Throwback" category can engage viewers who appreciate films from specific years or eras.
- 9. With a significant number of TV shows released exclusively in the United States, Netflix can continue investing in regional content production and acquisitions. By catering to specific markets, they can attract and retain subscribers in the United States and strengthen their position in the local streaming landscape.
- 10. The presence of movies featuring Salman Khan indicates an existing fan base for the actor. Netflix can leverage this popularity by promoting and marketing these movies prominently, targeting Salman Khan's fans, and exploring collaborations for exclusive content featuring the actor.
- 11. Given the high number of movies with a "TV-14" rating in India, Netflix can further expand its content library catering to Indian viewers. By acquiring or producing more content that aligns with Indian tastes and preferences, Netflix can strengthen its position in the Indian market and attract a larger audience.