Netflix-Dataset@Dhanureddy

April 11, 2024

1 Netflix data set exploration

Netflix is one of the most popular media and video streaming platforms. They have over 10000 movies or tv shows available on their platform, as of mid-2021, they have over 222M Subscribers globally. This tabular dataset consists of listings of all the movies and tv shows available on Netflix, along with details such as - cast, directors, ratings, release year, duration, etc.

Business problem

Netflix wants to know which type of shows/movies to produce and how they can grow the business in different countries. *italicized text*

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

```
[]: df = pd.read_csv('netflix.csv')
```

Finding Shape and datatypes of the DataFrame

```
[ ]: df.shape
```

[]: (8807, 12)

```
[]: df.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 8807 entries, 0 to 8806
Data columns (total 12 columns):

#	Column	Non-Null Count	Dtype
0	show_id	8807 non-null	object
1	type	8807 non-null	object
2	title	8807 non-null	object
3	director	6173 non-null	object
4	cast	7982 non-null	object
5	country	7976 non-null	object
6	date_added	8797 non-null	object

```
7
    release_year 8807 non-null
                                   int64
                   8803 non-null
 8
    rating
                                   object
 9
     duration
                   8804 non-null
                                   object
 10 listed in
                   8807 non-null
                                   object
 11 description
                                    object
                   8807 non-null
dtypes: int64(1), object(11)
memory usage: 825.8+ KB
```

- 1. As you can see the Netflix dataset has initial rows amounting to 8807 in total and columns amounting to 12.
- 2. In total six columns have some amount of Null values ('director', 'cast', 'country', date_added', 'rating', 'duration',)
- 3. And as you can observe 'release_year' was the only 'int-type' column and rest of others are string/object datatypes.
- —> Below are the codes for splitting the strings inside various categorical columns

```
[]: title_df = df["title"]
[]: country_df = df['country']
[]: cast_df = df['cast']
[]: director_df = df['director']
[]: rating_df = df['rating']
[]: listed_in_df = df['listed_in']
[]: def split_cast_names(inp):
    return str(inp).split(', ')
[]: df['country'] = country_df.apply(split_cast_names)
[]: df['director'] = director_df.apply(split_cast_names)
[]: df['director'] = director_df.apply(split_cast_names)
[]: df['listed_in'] = rating_df.apply(split_cast_names)
[]: df['listed_in'] = listed_in_df.apply(split_cast_names)
```

- 1. When we observe the entire dataset, we can come to the conclusion that **various columns in the dataset** have multiple **string values** which needed to be splitted into various individual rows to ascertain proper results and it is utmost for reliable data analysis
- —> Below is the DataFrame showing the result of split and that of how every string in each row of each column formed as a list

```
[]: df.head(3)
                                          title
                                                           director \
[]:
       show id
                    type
     0
                                                 [Kirsten Johnson]
            s1
                  Movie
                          Dick Johnson Is Dead
     1
            s2
                TV Show
                                 Blood & Water
                                                              [nan]
            s3
                TV Show
                                      Ganglands
                                                 [Julien Leclercq]
                                                        cast
                                                                      country \
     0
                                                       [nan]
                                                              [United States]
     1
        [Ama Qamata, Khosi Ngema, Gail Mabalane, Thaba...
                                                             [South Africa]
        [Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nab...
                                                                       [nan]
                                                       duration
                date_added release_year
                                             rating
        September 25, 2021
                                     2020
                                            [PG-13]
                                                         90 min
        September 24, 2021
                                     2021
                                            [AM-VT]
                                                     2 Seasons
     2 September 24, 2021
                                     2021
                                                       1 Season
                                            [TV-MA]
                                                  listed in \
     0
                                            [Documentaries]
       [International TV Shows, TV Dramas, TV Mysteries]
        [Crime TV Shows, International TV Shows, TV Ac...
                                                description
      As her father nears the end of his life, filmm...
     1 After crossing paths at a party, a Cape Town t...
        To protect his family from a powerful drug lor...
    —> After splitting, now we used explode function to make sure that each individual string of
    each column occupies each row; thus number of rows gets drastically increased to a staggering
    number of 201991.
[]: df = df.explode('country')
[]: df = df.explode('cast')
     df = df.explode('director')
[]: df = df.explode('listed_in')
[]: df = df.explode('rating')
[]: df
[]:
          show_id
                                             title
                                                            director
                       type
```

Kirsten Johnson

nan

nan

Dick Johnson Is Dead

Blood & Water

Blood & Water

0

1

1

s1

s2

s2

Movie

TV Show

TV Show

```
1
          s2 TV Show
                               Blood & Water
                                                           nan
1
          s2
              TV Show
                               Blood & Water
                                                           nan
8806
       s8807
                Movie
                                      Zubaan
                                                   Mozez Singh
8806
                Movie
                                      Zubaan
       s8807
                                                   Mozez Singh
8806
       s8807
                Movie
                                      Zubaan
                                                   Mozez Singh
8806
                Movie
                                      Zubaan
       s8807
                                                   Mozez Singh
8806
       s8807
                Movie
                                      Zubaan
                                                   Mozez Singh
                        cast
                                    country
                                                      date_added
                                                                   release_year \
0
                                              September 25, 2021
                         nan United States
                                                                           2020
1
                 Ama Qamata
                               South Africa
                                              September 24, 2021
                                                                           2021
1
                 Ama Qamata
                               South Africa
                                              September 24, 2021
                                                                           2021
1
                 Ama Qamata
                               South Africa
                                              September 24, 2021
                                                                           2021
1
                Khosi Ngema
                               South Africa
                                              September 24, 2021
                                                                           2021
8806
             Anita Shabdish
                                      India
                                                   March 2, 2019
                                                                           2015
8806
             Anita Shabdish
                                                   March 2, 2019
                                      India
                                                                           2015
8806
      Chittaranjan Tripathy
                                      India
                                                   March 2, 2019
                                                                           2015
      Chittaranjan Tripathy
                                      India
                                                   March 2, 2019
8806
                                                                           2015
8806
     Chittaranjan Tripathy
                                      India
                                                   March 2, 2019
                                                                           2015
              duration
     rating
                                      listed_in \
      PG-13
0
                90 min
                                  Documentaries
1
      TV-MA
             2 Seasons
                         International TV Shows
1
      TV-MA
             2 Seasons
                                      TV Dramas
                                   TV Mysteries
1
      TV-MA
             2 Seasons
1
      TV-MA
             2 Seasons
                        International TV Shows
8806 TV-14
               111 min
                           International Movies
8806 TV-14
               111 min
                               Music & Musicals
8806
     TV-14
               111 min
                                         Dramas
8806
     TV-14
               111 min
                           International Movies
8806
     TV-14
               111 min
                               Music & Musicals
                                              description
0
      As her father nears the end of his life, filmm...
1
      After crossing paths at a party, a Cape Town t...
1
      After crossing paths at a party, a Cape Town t...
1
      After crossing paths at a party, a Cape Town t...
      After crossing paths at a party, a Cape Town t...
1
8806 A scrappy but poor boy worms his way into a ty...
8806 A scrappy but poor boy worms his way into a ty...
8806 A scrappy but poor boy worms his way into a ty...
     A scrappy but poor boy worms his way into a ty...
8806
8806
      A scrappy but poor boy worms his way into a ty...
```

[201991 rows x 12 columns]

—> Below is the DataFrame Replacing nan values of each column to 'NaN'.

```
[]: df.replace('nan', np.NaN, inplace = True)
[]: df.head(3)
[]:
       show_id
                                         title
                                                       director
                                                                        cast
                                                                              \
                   type
                  Movie
                         Dick Johnson Is Dead Kirsten Johnson
                                                                         NaN
            ร1
     1
            s2
                TV Show
                                Blood & Water
                                                                 Ama Qamata
                                                            NaN
     1
            s2
                TV Show
                                Blood & Water
                                                            NaN
                                                                 Ama Qamata
              country
                               date_added release_year rating
                                                                  duration \
                       September 25, 2021
      United States
                                                    2020
                                                          PG-13
                                                                     90 min
         South Africa
                       September 24, 2021
                                                                 2 Seasons
                                                    2021
                                                          TV-MA
         South Africa
                       September 24, 2021
                                                    2021
                                                          TV-MA
                                                                 2 Seasons
                     listed_in
                                                                        description
     0
                 Documentaries
                                As her father nears the end of his life, filmm...
                                After crossing paths at a party, a Cape Town t...
     1
       International TV Shows
                                After crossing paths at a party, a Cape Town t...
                     TV Dramas
    —> Using fillna() to fill NaN values with corresponding values according to each type of column.
[]: df['director'] = df['director'].fillna('unknown director')
[]: df['cast'] = df['cast'].fillna('unknown cast')
[]: df['country'] = df['country'].fillna('unknown country')
     df['rating'] = df['rating'].fillna('unknown rating')
     df['date_added'] = df['date_added'].fillna(0)
[]: df['duration'] = df['duration'].fillna('0')
    —> DataFrame showing all replaced values for NaN types in each column
[]: df.head(5)
[]:
       show_id
                                         title
                                                        director
                                                                                \
                   type
                                                                           cast
     0
            s1
                  Movie
                        Dick Johnson Is Dead
                                                 Kirsten Johnson unknown cast
                                Blood & Water unknown director
     1
            s2 TV Show
                                                                     Ama Qamata
     1
            s2
                TV Show
                                Blood & Water unknown director
                                                                     Ama Qamata
                TV Show
                                Blood & Water unknown director
     1
            s2
                                                                     Ama Qamata
     1
            s2
                TV Show
                                Blood & Water unknown director
                                                                    Khosi Ngema
```

```
date_added release_year rating
                                                         duration
        country
O United States September 25, 2021
                                              2020 PG-13
                                                              90 min
                 September 24, 2021
   South Africa
                                              2021
                                                   TV-MA
                                                          2 Seasons
1
   South Africa September 24, 2021
                                              2021 TV-MA 2 Seasons
1
   South Africa September 24, 2021
                                              2021 TV-MA 2 Seasons
1
   South Africa September 24, 2021
                                              2021 TV-MA 2 Seasons
1
               listed in
                                                                 description
           Documentaries As her father nears the end of his life, filmm...
0
  International TV Shows After crossing paths at a party, a Cape Town t...
1
               TV Dramas After crossing paths at a party, a Cape Town t...
1
            TV Mysteries After crossing paths at a party, a Cape Town t...
1
  International TV Shows After crossing paths at a party, a Cape Town t...
```

Summary: Till now, we have expolored the initial phases of the dataset, cleaned the outliners and adjusted columns with NaN valeus and splitted the grouped string values of each column into multiple rows.

```
««««

»»»»
```

- 1. Count of categorical columns using non-graphical analysis.
 - (i) title counts

```
[]: No_of_unique_titles = df['title'].nunique()
No_of_unique_titles
```

[]: 8807

```
[]: Number_of_unique_movies = df[df['type'] == 'Movie']['title'].nunique()
Number_of_unique_movies
```

[]: 6131

```
[]: Number_of_unique_TVShows = df[df['type'] == 'TV Show']['title'].nunique()
Number_of_unique_TVShows
```

- []: 2676
 - (ii) director counts

[]: 4993

(iii) cast counts

```
[]: No_of_unique_actors = df[df['cast'] != 'unknown cast']['cast'].nunique()
No_of_unique_actors
```

- []: 36439
 - (iv) country counts

```
[]: No_of_unique_countries = df[df['country'] != 'unknown country']['country'].

⇔nunique()
No_of_unique_countries
```

- []: 127
 - (v) rating counts

```
[]: No_of_unique_ratings = df[df['rating'] != 'unknown country']['rating'].nunique()
No_of_unique_ratings
```

- []: 18
 - (vi) listed in counts

```
[]: No_of_unique_genres = df['listed_in'].nunique()
No_of_unique_genres
```

[]: 42

\(\(\)\(\)

2. Most Movies/TVshows produced grouping under different countries.

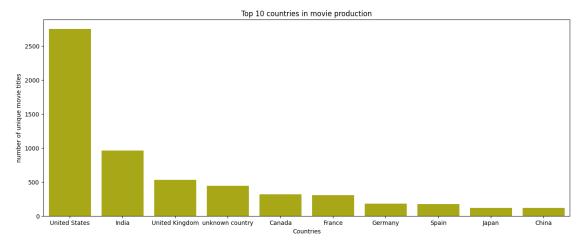
(Movies vs TV shows)

(i) Count of Total movies produced grouping under different countries including NaN values marked as 'unknown country'

```
[]: country title
0 United States 2751
1 India 962
2 United Kingdom 532
```

```
3
   unknown country
                        440
4
             Canada
                        319
5
             France
                        303
            Germany
6
                        182
7
              Spain
                        171
8
              Japan
                        119
9
              China
                        114
```

Graphical representation of Top 10 countries in movie production



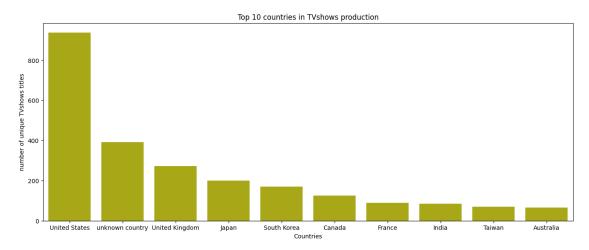
(ii) Count of Total shows produced grouping under different countries including NaN values marked as 'unknown country'

```
[]: country title
0 United States 938
```

```
unknown country
                        391
1
2
                         272
    United Kingdom
3
              Japan
                         199
4
       South Korea
                         170
5
             Canada
                         126
6
             France
                          90
7
              India
                          84
8
             Taiwan
                          70
9
          Australia
                          66
```

Graphical representation of Top 10 countries in TVshows production

```
[]: plt.figure(figsize = (16,6))
    sns.barplot(data = top_10_countries_in_shows_production, x = 'country', y =
        'title', color = 'y')
    plt.title('Top 10 countries in TVshows production')
    plt.xlabel('Countries')
    plt.ylabel('number of unique TVshows titles')
    plt.show()
```



—> "Unknown countries" values are not considered.

Insight: (Movies) As you can observe in the graph for Top 10 countries with movies production; 'United states' which stood at the top alone contributes approx 44.8 % of total movies hosted on Netflix. And the next countries 'India' and then 'United kingdom' together have a combined share of 24.3 %. Now, summing all the three countries, we get a total combined percentage of 69.1 % of total movie production, which is almost 20 percent above the half of production.

(TV Shows) Looking at the graph of Tvshows, we can observe that 'United states' (35%) and 'United kingdom' (10%) again occupied the first and second position assusual, but the third place is now occupied by Japan (7.43%). Even the fourth place occupied by 'Korea' (6.35%) is also very promising in future growth rate for TVshows production in their country. Thus, combined contribution of all top four countries in TVshows is almost 58.78%

Recommendation: Focusing on both US and UK is of utmost priority as they occupied the top spots in the Netflix hosting platform as highest contributors for most number of movies and TVshows and then emerging markets like 'India for movies and 'Japan & Korea' for Tvshows are also pretty great options for growth and diversty.

\(\langle \langle \lan

3. How was number of Movies/TVshows releases changed over time since past 30 years?

(i) Change of Number of Movies releases through time

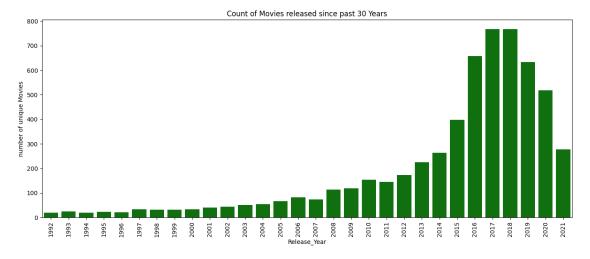
```
[]:
          release_year
                         title
                   2021
     0
                            277
     1
                   2020
                            517
     2
                   2019
                            633
     3
                   2018
                            767
     4
                   2017
                            767
     5
                   2016
                            658
     6
                   2015
                            398
     7
                   2014
                            264
     8
                            225
                   2013
     9
                   2012
                            173
     10
                   2011
                            145
                            154
     11
                   2010
     12
                   2009
                            118
     13
                   2008
                            113
     14
                   2007
                             74
     15
                   2006
                             82
     16
                   2005
                             67
     17
                   2004
                             55
     18
                             51
                   2003
     19
                   2002
                             44
     20
                   2001
                             40
     21
                   2000
                             33
     22
                   1999
                             32
     23
                             32
                   1998
     24
                   1997
                             34
     25
                   1996
                             21
     26
                   1995
                              23
```

```
    27
    1994
    20

    28
    1993
    24

    29
    1992
    20
```

Graphical representation of Number of movie releases since 1992

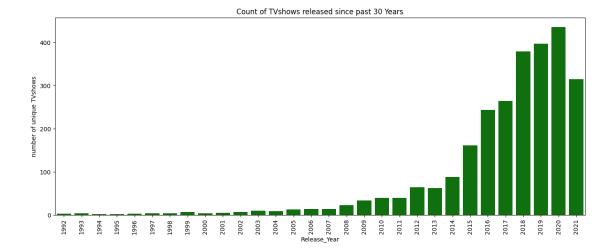


Change of Number of TVshows releases

```
[]: release_year title
0 2021 315
1 2020 436
2 2019 397
3 2018 380
```

```
4
                      265
             2017
5
             2016
                      244
6
             2015
                      162
7
                       88
             2014
8
             2013
                       63
             2012
                       64
9
10
             2011
                       40
11
             2010
                       40
12
             2009
                       34
13
             2008
                       23
14
             2007
                       14
15
             2006
                       14
16
             2005
                       13
17
             2004
                         9
18
             2003
                       10
             2002
                        7
19
                         5
20
             2001
21
             2000
                         4
                         7
22
             1999
                         4
23
             1998
24
             1997
                         4
                         3
25
             1996
26
             1995
                         2
27
                         2
             1994
28
             1993
                         4
                         3
29
             1992
```

Graphical representation of Number of TVshows releases since 1992



Insight: (Movies) Looking at the movies graph which are released since 1992, we can observe that netflix hosts most number of movie titles which were released in the period from 2015 to 2021. Almost a combined share of 65.5 % of total movies within the timeline of seven years. And most important insight would be of 2017 and 2018 which hold equal share in movie releases in the platform.

(TVshows) Looking at the graph of TVshows, we can observe that there was a rapid increment in the hosting of TVshows from 2013 and then the trend continued to escalate till 2020 and got suddenly reduced in 2021; it went below the graph line of of 2018, 2019 respectively. But specifically looking at the numbers, the releases from 2015-2021 holds a combined share of staggering 82.17% of total shows.

Recommendation: Even though netflix was started in 1997, Majority of its hosting movies and TVshows were released on and after 2015. It means most of the content in netflix was latest and that should exactly be the business strategy of any content providing platform. Replacing the old content with new ones was the best approach that it can follow to maintain the viewership.

\(\langle \langle \langle \langle \rangle \ran

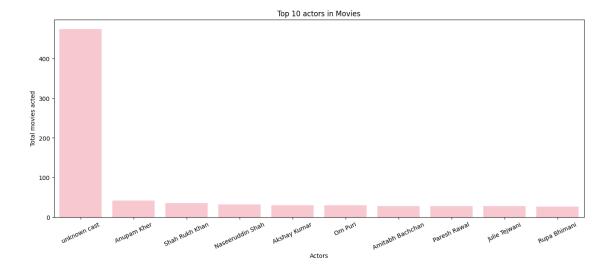
4. Top 10 best actors and directors in Movies/Tvshows.

(i) Top 10 actors in movies and Tvshows

Top 10 actors in Movies

```
[]:
                           title
                     cast
     0
            unknown cast
                             475
     1
             Anupam Kher
                              42
     2
          Shah Rukh Khan
                              35
       Naseeruddin Shah
                              32
     3
     4
            Akshay Kumar
                              30
     5
                 Om Puri
                              30
       Amitabh Bachchan
                              28
     7
            Paresh Rawal
                              28
     8
           Julie Tejwani
                              28
     9
            Rupa Bhimani
                              27
```

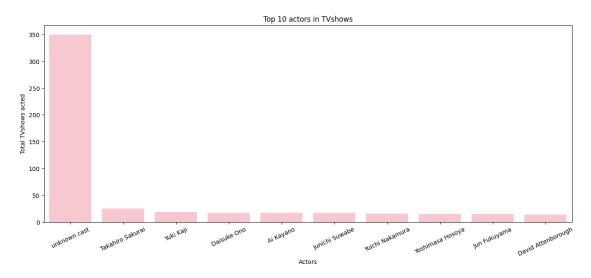
Graphical representation of Top 10 actors in Movies



Top 10 actors in TVshows

```
[]:
                       cast
                             title
     0
              unknown cast
                                350
     1
          Takahiro Sakurai
                                 25
     2
                 Yuki Kaji
                                 19
     3
                Daisuke Ono
                                 17
     4
                  Ai Kayano
                                 17
     5
            Junichi Suwabe
                                 17
           Yuichi Nakamura
     6
                                 16
     7
          Yoshimasa Hosoya
                                 15
     8
              Jun Fukuyama
                                 15
       David Attenborough
                                 14
```

Graphical representation of Top 10 actors in TV shows



Insight: (Movies): looking at the graph of top 10 actors in movies hosted in netflix, we can observe that actor named 'Anupham kher' stood at first with a total Movies count of 42 and then comes Sharukh khan with a total count of 35, interestingly both these people are from Bollywood film industry in India. And not only that, because, most of the actors who appeared in the list are actors from Bollywood.

(TVshows): Coming to Tvshows, we know that india is still an emerging market in this area, thus most of the actors are from other parts of asia like Japan, korea, china etc.

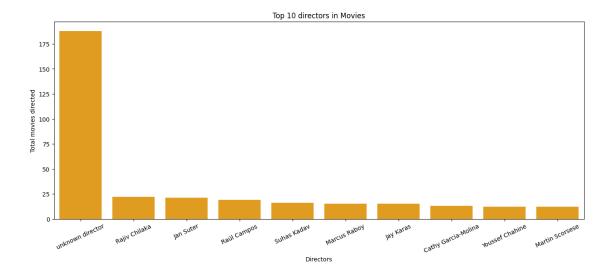
Recommendation: As India was a major hotspot for movies, people in india are emotionally very connected to watch films. Thus, it would be an opportunity for netflix to promote Indian actors and cast them into new Movies. And for Tvshows, actors from Japan, Korea and china are the best fit.

(ii) Top 10 directors in Movies and TVshows

Top 10 directors in movies

```
[]:
                   director title
    0
           unknown director
                               188
     1
              Rajiv Chilaka
                                22
                  Jan Suter
                                21
     3
                Raúl Campos
                                19
     4
                Suhas Kadav
                                16
               Marcus Raboy
     5
                                15
     6
                  Jay Karas
                                15
     7 Cathy Garcia-Molina
                                13
            Youssef Chahine
     8
                                12
     9
            Martin Scorsese
                                12
```

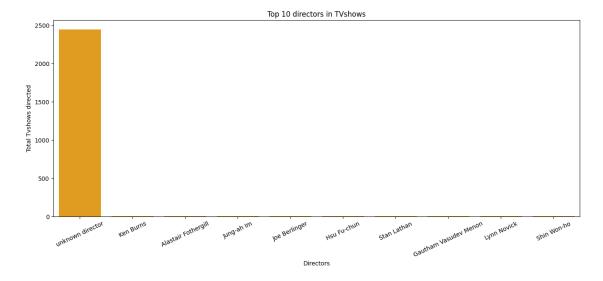
Graphical representation of top 10 directors in Movies



Top 10 directors in TVshows

```
[]:
                      director title
     0
             unknown director
                                 2446
     1
                     Ken Burns
                                     3
     2
          Alastair Fothergill
                                     3
     3
                    Jung-ah Im
                                     2
     4
                 Joe Berlinger
                                     2
     5
                  Hsu Fu-chun
                                     2
     6
                  Stan Lathan
                                     2
     7
                                     2
        Gautham Vasudev Menon
                  Lynn Novick
                                     2
     8
     9
                  Shin Won-ho
```

Graphical representation of top 10 directors in TVshows



—> As majority of directors in TVshowsa are unknown values, i cannot give any probabale insight or recommendation.

\(\langle \langle \langle \langle \)

5. Most produced genre content in movies and TVshows

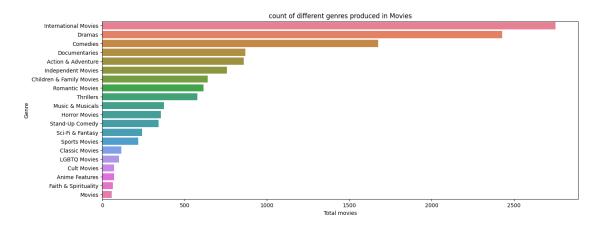
(i) Most produced genre content in Movies

```
[]: listed_in title
0 International Movies 2752
1 Dramas 2427
```

```
2
                     Comedies
                                 1674
3
                                  869
                Documentaries
4
          Action & Adventure
                                  859
5
          Independent Movies
                                  756
6
    Children & Family Movies
                                  641
7
             Romantic Movies
                                  616
8
                    Thrillers
                                  577
9
            Music & Musicals
                                  375
                Horror Movies
10
                                  357
11
             Stand-Up Comedy
                                  343
12
            Sci-Fi & Fantasy
                                  243
13
                Sports Movies
                                  219
14
               Classic Movies
                                  116
15
                 LGBTQ Movies
                                  102
16
                                   71
                  Cult Movies
17
               Anime Features
                                   71
18
                                   65
        Faith & Spirituality
19
                       Movies
                                   57
```

Graphical representation of most produced movie genres

[]: Text(0, 0.5, 'Genre')

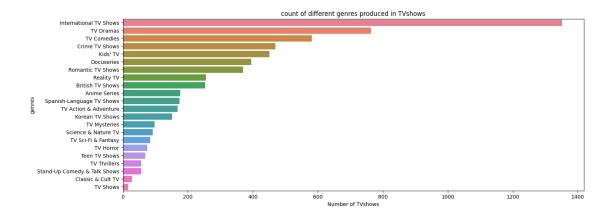


(ii) Most produced genre content in TVshows

```
[]:
                             listed in title
                International TV Shows
     0
                                          1351
                             TV Dramas
                                           763
     1
     2
                           TV Comedies
                                           581
     3
                        Crime TV Shows
                                           470
     4
                              Kids' TV
                                           451
     5
                            Docuseries
                                           395
     6
                     Romantic TV Shows
                                           370
     7
                            Reality TV
                                           255
     8
                      British TV Shows
                                           253
     9
                          Anime Series
                                           176
     10
            Spanish-Language TV Shows
                                           174
     11
                TV Action & Adventure
                                           168
     12
                       Korean TV Shows
                                           151
     13
                          TV Mysteries
                                            98
                   Science & Nature TV
     14
                                            92
     15
                   TV Sci-Fi & Fantasy
                                            84
     16
                             TV Horror
                                            75
     17
                         Teen TV Shows
                                            69
     18
                          TV Thrillers
                                            57
     19
         Stand-Up Comedy & Talk Shows
                                            56
     20
                     Classic & Cult TV
                                            28
     21
                              TV Shows
                                            16
```

Graphical representation of most produced Tvshow genres

[]: Text(0, 0.5, 'genres')



—> Because of the splitting of of 'listed_in' column, we have a repeated count of the movie titles which comes under multiple genres. But anyway our insight doesn't get affected.

Insight: (Movies) Looking at the graph of Top genres in movies, we can observe that major movie tites belong to these five genres 'International Movies', 'Dramas', 'comedies', 'Documentaries', and 'Action & Adventure'. And the bottom ones are 'LGTBQ+', 'cult', 'family /spirituality' and 'Anime'.

(TVshows) Looking at the graph of Top ten genres in TVshows, we can observe that major TVshow titles belong to these five genres 'International TV shows', 'Drama', 'Comedies', 'crime', and 'Kids'. But if we observe the bottom ones we can see genres like 'horror', 'teen shows', 'thrillers', 'stand_up comedy & talkshows', and 'cult'.

Recommedation: Upon closer examination of both graphs, it becomes evident that the majority of productions, whether movies or TV shows, fall under genres such as International, Comedy, or Drama, or a combination thereof. This combination emerges as a high priority. Notably, the genre 'Cult,' which occupies the bottom position in both movies and TV shows, is underproduced and not recommended.

6. What kind of content is available in different countries?

(i) Number of movies produced grouping under countries and genres

```
[]: country listed_in title
0 India International Movies 864
1 United States Dramas 835
```

```
2
      United States
                                      Comedies
                                                   680
3
                                                   662
              India
                                        Dramas
4
      United States
                                 Documentaries
                                                   511
5
      United States
                            Action & Adventure
                                                   404
6
      United States
                            Independent Movies
                                                   390
      United States
                     Children & Family Movies
7
                                                   390
8
              India
                                      Comedies
                                                   323
9
                                                   292
      United States
                                     Thrillers
      United States
                               Romantic Movies
                                                   225
10
11
      United States
                               Stand-Up Comedy
                                                   216
12
    unknown country
                          International Movies
                                                   209
13
             France
                          International Movies
                                                   207
14
     United States
                                 Horror Movies
                                                   201
15
     United Kingdom
                                        Dramas
                                                   196
     United States
16
                              Sci-Fi & Fantasy
                                                   181
17
     United Kingdom
                          International Movies
                                                   168
             France
18
                                        Dramas
                                                   167
19
              India
                            Independent Movies
                                                   167
```

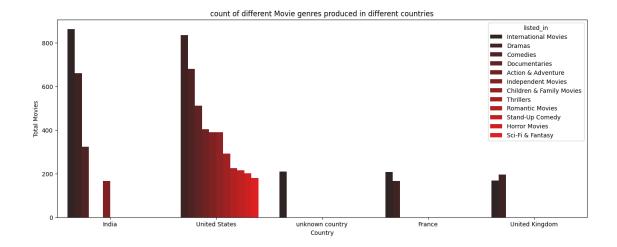
Graphical representation of Movies produced under different genres in different countries

<ipython-input-129-aaaa6d90e851>:2: FutureWarning:

Setting a gradient palette using color= is deprecated and will be removed in v0.14.0. Set `palette='dark:r'` for the same effect.

```
sns.barplot(data = division_of_Moviegenre_in_countries, x='country', y =
'title', hue ='listed_in', color = 'r')
```

[]: Text(0, 0.5, 'Total Movies')



(ii) Number of TVshows produced grouping under countries and genres

[]:	country	listed_in	title
0	United States	TV Comedies	258
1	United States	TV Dramas	232
2	United Kingdom	British TV Shows	225
3	unknown country	International TV Shows	223
4	United States	Kids' TV	214
5	United States	Docuseries	192
6	South Korea	International TV Shows	152
7	Japan	International TV Shows	151
8	United States	Crime TV Shows	145
9	Japan	Anime Series	143
10	South Korea	Korean TV Shows	132
11	United Kingdom	International TV Shows	128
12	United States	Reality TV	123
13	unknown country	TV Dramas	100
14	United States	TV Action & Adventure	94
15	United Kingdom	Docuseries	89
16	unknown country	Kids' TV	81
17	unknown country	TV Comedies	80
18	South Korea	Romantic TV Shows	77
19	United States	International TV Shows	74

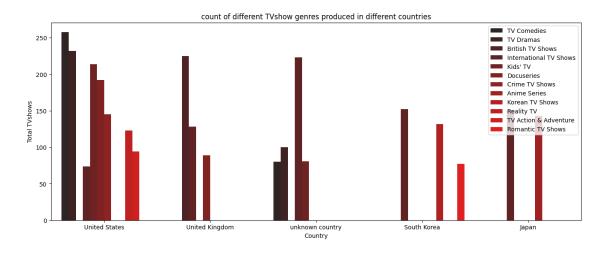
Graphical representation of TVshows produced under different genres in different countries

<ipython-input-133-3c9b26cb6eee>:2: FutureWarning:

Setting a gradient palette using color= is deprecated and will be removed in v0.14.0. Set `palette='dark:r'` for the same effect.

sns.barplot(data = division_of_genre_in_countries, x='country', y = 'title',
hue ='listed in', color = 'r')

[]: <matplotlib.legend.Legend at 0x7e1c7c62af20>



Insight: (Movies) Observing the graph of movies produced under different genres in different countries we can pretty much conclude that USA tops in Netflix listing of movies in different genres, it occupied almost all 12 movie genres with a staggering record. While on the other hand India holds high count in genres like International, dramas and comedies. Coming to countries like UK & France they were max occupied with genres like International & Drama.

(TVshows) Observing the graph of TVshows produced under different genres in different countries we can reasonably conclude that again Netflix hosts most diverse contet from USA. 'Britian' similar to their movies production, were sticking with Dramas and domestic britian TVshows. Other countries like South korea and japan are producing International TV shows and their individual domestic Tvshows.

Recommendation: For both Movies and TVshows, American content is the best one running in netflix. Genres like International, Comedy, Dramas, Action, Documentaries have very strong viewership; hence focusing on american content withrespect to these genres yield high results. And

then content from UK holds second most advantageous position for both movies and TVshows in similar genres. After that we have other countries like India, which is an emerging online streaming platform for movies genres like International, dramas and comedies. Also eastern countries like Japan and korea were noticed for their distinct, feelgood romantic TVshows.

```
\(\lambda \lambda \lam
```

-> Formatting 'date_added' column to extract week and month

```
[]: df['date_added'] = pd.to_datetime(df['date_added'], errors='coerce')
[]: df['week_added'] = df['date_added'].dt.isocalendar().week
```

```
[]: df['month_added'] = df['date_added'].dt.month
```

- 7. Analysis on best time to launch Movies/TVshows
- (i) Best Week and Month to launch Movies

Best weeks

```
[]:
           week_added
                         title
      0
                      1
                            316
                      2
      1
                             78
                      3
      2
                             81
      3
                      4
                             56
                      5
      4
                            135
      5
                      6
                             64
      6
                      7
                            106
      7
                      8
                             72
      8
                      9
                            207
      9
                     10
                            107
      10
                     11
                            115
      11
                     12
                             67
      12
                     13
                            174
      13
                     14
                            124
      14
                     15
                            100
      15
                            124
                     16
      16
                     17
                            109
      17
                     18
                            173
                             73
      18
                     19
      19
                     20
                             85
      20
                     21
                             76
      21
                     22
                            146
```

```
22
             23
                    112
23
             24
                     89
24
             25
                    101
25
             26
                    195
26
             27
                    154
27
             28
                     89
28
             29
                     94
29
             30
                    116
30
             31
                    185
31
             32
                     73
32
             33
                    105
                    102
33
             34
34
             35
                    189
35
             36
                     97
36
             37
                    114
37
             38
                     88
38
             39
                    111
39
                    215
             40
40
             41
                     84
41
             42
                     90
42
             43
                     88
43
             44
                    243
44
             45
                     61
45
             46
                     83
46
             47
                     85
47
             48
                    139
48
             49
                     95
49
             50
                    119
50
             51
                     86
             52
                     80
51
52
             53
                     61
```

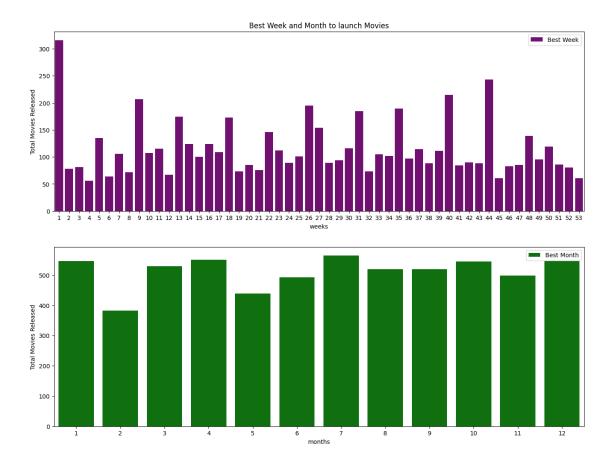
Best months

```
[]:
         month_added title
     0
                    1
                         546
     1
                    2
                         382
     2
                    3
                         529
     3
                    4
                         550
                         439
     4
                    5
     5
                    6
                         492
```

```
565
6
                7
7
                8
                     519
8
                9
                     519
9
              10
                     545
10
              11
                     498
11
              12
                     547
```

Graphical representation of best weeks/months for launching movies using barplot

```
[]: Text(0, 0.5, 'Total Movies Released')
```



Ignoring the first week in the both graph, as by default the null values in the date_added column are replaced by a default value '01-01-1970'

Insight: (Movies) If we observe the graph, most movies were released on 44th week and 7th month. Weeks like 9th, 13th, 18th, 22nd, 26th, 27th, 31st, 35th, 40th, 44th held as major weeks for movie releases. And coming to months, all most every month except 2 and 5 held most releases on netflix.

Recommendation: At the beginning of six months, releasing movies during first and second weeks tend to be higher, thus, the same was suggested, whereas coming to the other half, releasing the movies in 3rd and 4th weeks tends to be desirable.

(ii) Best Week and month to launch TVshows

Best weeks

[]:	week_added	title
0	1	66
1	2	30
2	3	32
3	4	32
4	5	73
5	6	33
6	7	41
7	8	38
8	9	47
9	10	28
10	11	48
11	12	42
12	13	76
13	14	49
14	15	52
15	16	36
16	17	45
17	18	61
18	19	43
19	20	46
20	21	41
21	22	60
22	23	39
23	24	75
24	25	42
25	26	73
26 27	27 28	86 41
	29	41
28 29	30	44
30	31	83
31	32	49
32	33	48
33	34	41
34	35	74
35	36	45
36	37	69
37	38	51
38	39	55
39	40	72
40	41	32
41	42	45
42	43	28
43	44	75
44	45	37
45	46	51

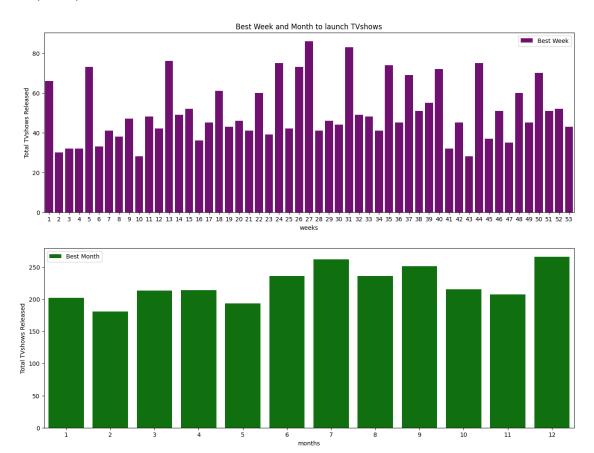
```
46
              47
                      35
47
                      60
              48
48
              49
                      45
                      70
49
              50
50
              51
                      51
51
              52
                      52
52
              53
                      43
```

Best months

```
[]:
          month_added title
                      1
                            202
     0
     1
                      2
                            181
     2
                      3
                            213
     3
                      4
                            214
     4
                      5
                            193
     5
                      6
                            236
     6
                      7
                            262
     7
                      8
                            236
                      9
                           251
     8
     9
                     10
                            215
     10
                     11
                            207
     11
                     12
                            266
```

Graphical representation of best weeks/months for launching TVshows using barplot

[]: Text(0, 0.5, 'Total TVshows Released')



Ignoring the first week in the both graph, as by default the null values in the date_added column are replaced by a default value '01-01-1970'

Insight: (TVshows) If we observe the graph, most shows were released on 44th week and 7th month. Weeks like 5th, 13th, 18th, 24th, 26th, 27th, 31st, 35th, 37th, 40th, 44th, 48th, 50th held as major weeks for Tvshow releases. And coming to months 6,7,8,9,12 held most releases.

Recommendation: Most TVshows were released more in 3rd and 4th weeks and hence releasing the future installations during these periods tend to be advantageous.

8. Finding how many approx years it takes for a movie/Tvshow to be added on netflix after its initial original release.

```
[]: df['year_diff'] = df['date_added'].dt.year - df['release_year']
```

—> Ignore (1970) year, they are by default null_value replacement

```
[]: Approx_time_taken_in_years = df[['date_added', 'release_year', 'year_diff']]
Approx_time_taken_in_years.sort_values(by = 'year_diff', ascending = False)
```

```
[]:
          date_added
                       release_year
                                      year_diff
     4250 2018-12-30
                                1925
                                             93
     1331 2021-02-09
                                1945
                                             76
     8205 2017-03-31
                                             75
                                1942
     8205 2017-03-31
                                1942
                                             75
     8205 2017-03-31
                                             75
                                1942
     7406 1970-01-01
                                2016
                                             -46
     7406 1970-01-01
                                2016
                                             -46
     7406 1970-01-01
                                2016
                                             -46
     7406 1970-01-01
                                2016
                                             -46
     6174 1970-01-01
                                2018
                                             -48
```

[201991 rows x 3 columns]

Insight: The highest time difference is 93 years, which indicates that netflix often do hosts and experiment with some pretty old movies/TVshows. We also have movies/TvShows ageing in 70's and 60's.

Recommendation: Experimenting is good and sometimes a few old classics might savour the taste of niche group of audiences, but it was desiarble to focus on fresh content of movies/TVShows.

\(\langle \langle \lan

- 9. Finding which rating and genre combination holds more movie/TVshows releases.
- (i) Top 10 (rating and genre) combination holding most movies

```
[]:
                                  listed_in
        rating
                                              title
     0
         TV-MA
                      International Movies
                                               1130
     1
         TV-14
                      International Movies
                                               1065
     2
         TV-MA
                                     Dramas
                                                830
     3
         TV-14
                                     Dramas
                                                693
     4
         TV-14
                                   Comedies
                                                465
     5
         TV-MA
                                   Comedies
                                                431
     6
              R.
                                     Dramas
                                                375
     7
         TV-MA
                        Independent Movies
                                                344
         TV-MA
                             Documentaries
                                                321
     8
     9
         TV-PG
                      International Movies
                                                294
         TV-MA
                           Stand-Up Comedy
                                                291
     10
     11
         TV-MA
                                  Thrillers
                                                240
     12
         TV-14
                             Documentaries
                                                227
```

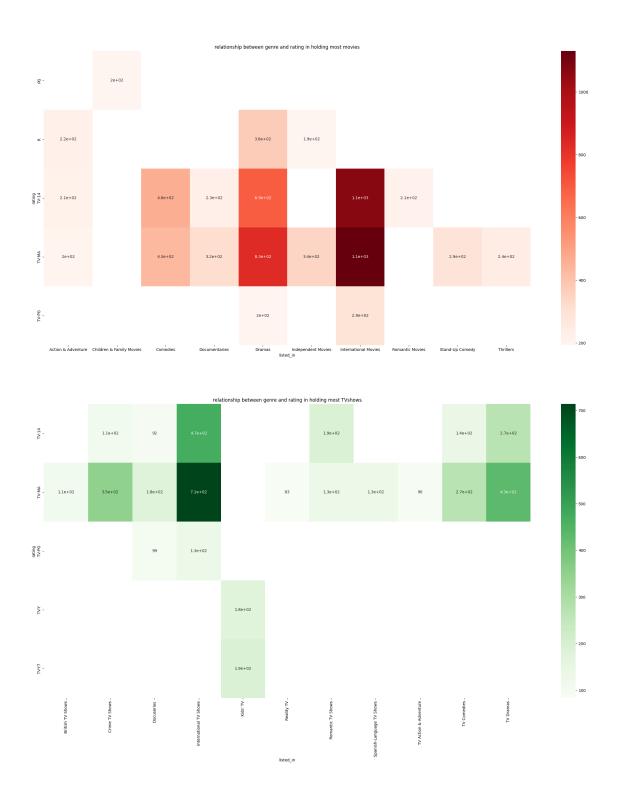
```
13
        R
                 Action & Adventure
                                         220
14
   TV-14
                  Action & Adventure
                                         213
15
   TV-14
                     Romantic Movies
                                         208
16
   TV-MA
                  Action & Adventure
                                         201
17
   TV-PG
                              Dramas
                                         200
18
       PG
           Children & Family Movies
                                         195
19
        R.
                  Independent Movies
                                         193
```

(ii) Top 10 (rating and genre) combination holding most TVshows

```
[]:
        rating
                                 listed_in title
         TV-MA
                   International TV Shows
                                              714
        TV-14
                                              472
     1
                   International TV Shows
     2
         TV-MA
                                 TV Dramas
                                              434
     3
        TV-MA
                           Crime TV Shows
                                              350
     4
        TV-MA
                               TV Comedies
                                              269
     5
        TV-14
                                 TV Dramas
                                              269
     6
        TV-14
                        Romantic TV Shows
                                              190
     7
         TV-Y7
                                  Kids' TV
                                              189
     8
         TV-MA
                               Docuseries
                                              179
     9
          TV-Y
                                  Kids' TV
                                              176
     10 TV-14
                               TV Comedies
                                              140
     11 TV-PG
                   International TV Shows
                                              134
     12 TV-MA
                        Romantic TV Shows
                                              132
     13 TV-MA
                Spanish-Language TV Shows
                                              130
     14 TV-14
                            Crime TV Shows
                                              111
     15 TV-MA
                         British TV Shows
                                              108
     16 TV-PG
                                               99
                                Docuseries
     17 TV-14
                                Docuseries
                                               92
     18 TV-MA
                    TV Action & Adventure
                                               90
     19 TV-MA
                                Reality TV
                                               83
```

Graphical representation using **Heat map** of Genre and rating combination on movies/Tvshows

[]: Text(0.5, 1.0, 'relationship between genre and rating in holding most TVshows')



Insight: (Movies) Observing the Top 10 (rating and genre) combination holding most number of movies, thus, we can conclude that there was high positive correlation between majority of international movies and ratings like 'TV 14', 'TV MA'. Even majority of Dramas got the same types of correlation with similar ratings. Least correlation was observed in International movies

and 'TV PG' rating, and other genres like Action&Adventure have least correlation with 'TV MA', 'TV 14' AND 'R' rating types and a few genres like Independent movies and Documentaries also have same correlation with 'TV MA'.

(TVshows): Observing the Top 10 (rating and genre) combination holding most TVShows, we can conclude that there is high positive correlation between majority of international TVshows and 'TV MA','TV 14' rating types. Least correlation was observed in Docuseries with 'TV PG','TV 14', and even shows like Realities and adventures have less correlation with TV MA rating. Same follows with Kids-TV and 'TV Y7', 'TV Y' rating types which have low correlation.

Recommendation: As most movies and TVshows hosted in Netflix belong to 'TV MA' rating type and holds good positive correlation; It is advantageous to lauch contents like, International movies/TVshows and Dramas with similar style and theme which ultimately falls under the above rating.

\(\langle \langle \langle \langle \rangle \ran

10. Count of Movie/TVshows titles grouping under duration

(i) Top 10 Movie runtimes holding most number of movies

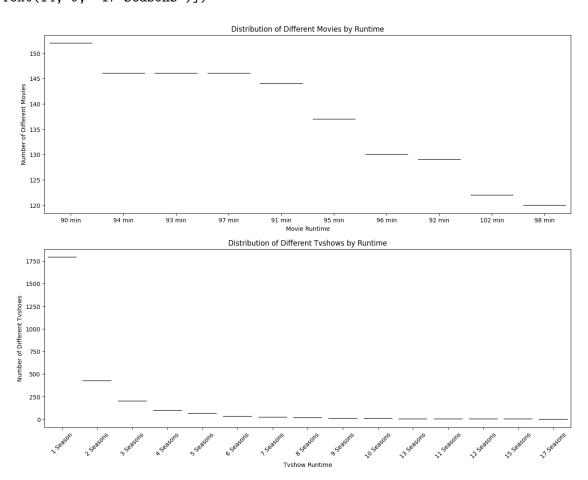
```
Г1:
       duration title
          90 min
                     152
     1
          94 min
                     146
     2
          93 min
                     146
     3
          97 min
                     146
     4
          91 min
                     144
     5
          95 min
                     137
     6
          96 min
                     130
     7
          92 min
                     129
     8
        102 min
                     122
     9
          98 min
                     120
```

(ii) finding under what number of Seasons netflix produced most number of TVshows

```
[]:
           duration title
     0
           1 Season
                      1793
     1
          2 Seasons
                       425
     2
          3 Seasons
                       199
     3
          4 Seasons
                         95
     4
          5 Seasons
                         65
     5
          6 Seasons
                         33
     6
          7 Seasons
                         23
     7
          8 Seasons
                         17
     8
          9 Seasons
                          9
     9
                          7
         10 Seasons
     10 13 Seasons
                          3
                          2
     11 11 Seasons
                          2
     12
        12 Seasons
                          2
     13
        15 Seasons
     14 17 Seasons
                          1
```

Graphical representation of Movie/Tvshow durations using Violin plot

Text(13, 0, '15 Seasons'), Text(14, 0, '17 Seasons')])



Insight: (Movies) If we observe the graph of different movies by runtime, we could oberve that most movies have a run time between 1:30 min to 1:40 min.

(TVhows): If we observe the graph of different Tvshows by runtime, we could pretty much conclude that netflix majorily produces or hosts shows with max 1 season of runtime (contributing 67%) of netflix total shows, and then next positions were occupied in a decreasing order of seasons. We have '17' TV shows crossing the mark of 10 seasons out of 2676 shows. And especially there is only one show that reached the mark of 17 seasons in total.

Recommendation: Given that the majority of hosted movies are English, American, and British productions, the optimal duration falls between 1:30 and 1:40. However, for TV shows, the trend indicates that many conclude after their first season. Thus, extending beyond one season warrants careful consideration, with factors such as content, actors, and directors being crucial, particularly for genres with broad appeal like International Drama, Thriller, or Comedy.

[1]: !pip install nbconvert

Requirement already satisfied: nbconvert in /usr/local/lib/python3.10/dist-