

4zcyj6qt6f

March 10, 2025

## 1 Business Case Study - Netflix

## 2 Business Problem

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

## 3 About NETFLIX

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.

## 4 Objectives of the Project

- Perform EDA on the given dataset and find insights.
- Provide Useful Insights and Business recommendations that can help the business to grow.

## 5 1) Importing Libraries and the Netflix dataset

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

```
[ ]: !gdown 1r1xysMLi3PED70IIAaFI0CLZ0T1JxjB4
```

Downloading...

From: <https://drive.google.com/uc?id=1r1xysMLi3PED70IIAaFI0CLZ0T1JxjB4>

To: /content/netflix.csv

100% 3.40M/3.40M [00:00<00:00, 189MB/s]

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

```

[ ]:  show_id      type      title      director \
0      s1      Movie      Dick Johnson Is Dead      Kirsten Johnson
1      s2      TV Show      Blood & Water      NaN
2      s3      TV Show      Ganglands      Julien Leclercq
3      s4      TV Show      Jailbirds New Orleans      NaN
4      s5      TV Show      Kota Factory      NaN

                                cast      country \
0                                NaN      United States
1      Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...      South Africa
2      Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...      NaN
3                                NaN      NaN
4      Mayur More, Jitendra Kumar, Ranjan Raj, Alam K...      India

      date_added      release_year      rating      duration \
0      September 25, 2021      2020      PG-13      90 min
1      September 24, 2021      2021      TV-MA      2 Seasons
2      September 24, 2021      2021      TV-MA      1 Season
3      September 24, 2021      2021      TV-MA      1 Season
4      September 24, 2021      2021      TV-MA      2 Seasons

                                listed_in \
0                                Documentaries
1      International TV Shows, TV Dramas, TV Mysteries
2      Crime TV Shows, International TV Shows, TV Act...
3                                Docuseries, Reality TV
4      International TV Shows, Romantic TV Shows, TV ...

                                description
0      As her father nears the end of his life, filmm...
1      After crossing paths at a party, a Cape Town t...
2      To protect his family from a powerful drug lor...
3      Feuds, flirtations and toilet talk go down amo...
4      In a city of coaching centers known to train I...

```

Lets check the shape and data distribution of the data set

```
[ ]: netflix.shape
```

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

There are 8807 rows and 12 columns in the given dataset Lets check the info

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

```

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

```

| #  | Column       | Non-Null Count | Dtype  |
|----|--------------|----------------|--------|
| 0  | show_id      | 8807 non-null  | object |
| 1  | type         | 8807 non-null  | object |
| 2  | title        | 8807 non-null  | object |
| 3  | director     | 6173 non-null  | object |
| 4  | cast         | 7982 non-null  | object |
| 5  | country      | 7976 non-null  | object |
| 6  | date_added   | 8797 non-null  | object |
| 7  | release_year | 8807 non-null  | int64  |
| 8  | rating       | 8803 non-null  | object |
| 9  | duration     | 8804 non-null  | object |
| 10 | listed_in    | 8807 non-null  | object |
| 11 | description  | 8807 non-null  | object |

dtypes: int64(1), object(11)  
memory usage: 825.8+ KB

```
[ ]: netflix.nunique()
```

```
[ ]: show_id      8807
      type         2
      title      8807
      director   4528
      cast       7692
      country     748
      date_added 1767
      release_year 74
      rating      17
      duration   220
      listed_in   514
      description 8775
      dtype: int64
```

```
[ ]: netflix.describe()
```

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

```
[ ]: netflix.describe(include=object)
```

```
[ ]:      show_id  type      title      director \
count      8807    8807      8807      6173
unique      8807      2      8807      4528
top         s1  Movie  Dick Johnson Is Dead  Rajiv Chilaka
freq         1   6131      1      19

      count      cast      country      date_added rating  duration \
count      7982      7976      8797    8803      8804
unique      7692      748      1767     17      220
top    David Attenborough  United States  January 1, 2020  TV-MA  1 Season
freq         19      2818      109    3207      1793

      count      listed_in \
count      8807
unique      514
top    Dramas, International Movies
freq      362

      count      description
count      8807
unique      8775
top    Paranormal activity at a lush, abandoned prope...
freq      4
```

## 6 2) Statistical Summary

Most common country : United States (2,818 shows)

Most frequent rating : TV-MA (3,207 shows)

Most common category : Dramas, International Movies

Earliest release year : 1925

Latest release year : 2021

## 7 3) Non graphical analysis

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

```
[ ]: type
Movie      6131
TV Show    2676
Name: count, dtype: int64
```

There are only two types of contents on Netflix

- TV Shows
- Movies

Moviews are almost 3 times higher than TV shows

```
[ ]: netflix['director'].value_counts()
```

```
[ ]: director
Rajiv Chilaka                19
Raúl Campos, Jan Suter       18
Marcus Raboy                 16
Suhask Kadav                 16
Jay Karas                    14
..
Raymie Muzquiz, Stu Livingston 1
Joe Menendez                 1
Eric Bross                   1
Will Eisenberg              1
Mozes Singh                  1
Name: count, Length: 4528, dtype: int64
```

Rajiv Chillaka has directed most number of Movies/TV Shows

```
[ ]: netflix['country'].value_counts()
```

```
[ ]: country
United States                2818
India                       972
United Kingdom              419
Japan                       245
South Korea                 199
...
Romania, Bulgaria, Hungary    1
Uruguay, Guatemala           1
France, Senegal, Belgium      1
Mexico, United States, Spain, Colombia 1
United Arab Emirates, Jordan  1
Name: count, Length: 748, dtype: int64
```

The United States has the highest count of content (2818)

```
[ ]: netflix['date_added'].value_counts()
```

```
[ ]: date_added
January 1, 2020             109
November 1, 2019            89
March 1, 2018               75
December 31, 2019           74
October 1, 2018             71
...
December 4, 2016            1
```

```

November 21, 2016      1
November 19, 2016      1
November 17, 2016      1
January 11, 2020       1
Name: count, Length: 1767, dtype: int64

```

Most Content were added on January 1, 2020.

```
[ ]: (netflix['release_year'].min(),netflix['release_year'].max())
```

```
[ ]: (1925, 2021)
```

The oldest content on Netflix was released in 1925. The newest content was released in 2021.

```
[ ]: netflix['rating'].value_counts()
```

```

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

```

TV-MA (3207) is the most common rating.

```
[ ]: netflix.groupby('type')['duration'].value_counts()
```

```

[ ]: type    duration
Movie    90 min      152
         93 min      146
         94 min      146
         97 min      146
         91 min      144
...
TV Show  13 Seasons    3

```

|            |   |
|------------|---|
| 11 Seasons | 2 |
| 12 Seasons | 2 |
| 15 Seasons | 2 |
| 17 Seasons | 1 |

Name: count, Length: 220, dtype: int64

We can see that duration of movies is in minutes and TV Shows in Seasons

```
[ ]: netflix['listed_in'].value_counts()
```

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

Netflix has most contents on the genre - Dramas, International Movies

---

### Observations

- There are two types of contents -
  1. Movies
  2. TV Shows
- Rajiv Chillaka has directed most number of Movies/TV Shows
- The United States has the highest count of content and India at Second Position
- Most content were added in the Year 2020
- The oldest content on Netflix was released in 1925, indicating that Netflix includes some very old or classic titles in its library. This suggests that Netflix offers a mix of historical and vintage content, likely appealing to audiences interested in classic films or shows. The newest content was released in 2021, showing that Netflix regularly updates its library with recent and contemporary titles.
- TV-MA (3207) is the most common rating, indicating that a significant portion of Netflix's content is intended for mature audiences only. This suggests that Netflix has a large selection of content that may contain adult themes, strong language, or graphic violence.
- Movies length is measured in minutes and TV Shows by Seasons
- Netflix has most contents on the genre - Dramas, International Movies

## 8 4) Data Cleaning

Lets check the null values in each

```
[ ]: netflix.isna().sum()
```

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

### 9 4.1) Cleaning date added column

```
[ ]: netflix['date_added'].isna().sum()
```

```
[ ]: 10
```

```
[ ]: netflix.drop(netflix[netflix['date_added'].isna()].index, inplace=True)
```

For 'date\_added' column, all values confirm to date format, So we can convert its data type from object to datetime

```
[ ]: netflix['date_added'] = pd.to_datetime(netflix['date_added'].str.strip())
     netflix['date_added']
```

```
[ ]: 0      2021-09-25
     1      2021-09-24
     2      2021-09-24
     3      2021-09-24
     4      2021-09-24
     ...
     8802   2019-11-20
     8803   2019-07-01
     8804   2019-11-01
     8805   2020-01-11
     8806   2019-03-02
     Name: date_added, Length: 8797, dtype: datetime64[ns]
```

#### 2.2) Cleaning Rating Column



## 10 4.2) Cleaning Rating Column

```
[ ]: netflix['rating'].isna().sum()
```

```
[ ]: 4
```

```
[ ]: netflix_NaN_index=netflix[netflix['rating'].isna()].index
```

```
[ ]: netflix.loc[netflix_NaN_index]
```

```
[ ]:      show_id      type      title \
5989    s5990    Movie  13TH: A Conversation with Oprah Winfrey & Ava ...
6827    s6828  TV Show      Gargantia on the Verdurous Planet
7312    s7313  TV Show      Little Lunch
7537    s7538    Movie      My Honor Was Loyalty

      director      cast \
5989      NaN      Oprah Winfrey, Ava DuVernay
6827      NaN  Kaito Ishikawa, Hisako Kanemoto, Ai Kayano, Ka...
7312      NaN  Flynn Curry, Olivia Deeble, Madison Lu, Oisín ...
7537  Alessandro Pepe  Leone Frisa, Paolo Vaccarino, Francesco Miglio...

      country date_added  release_year rating  duration \
5989      NaN  2017-01-26      2017     NaN    37 min
6827    Japan  2016-12-01      2013     NaN    1 Season
7312  Australia  2018-02-01      2015     NaN    1 Season
7537    Italy  2017-03-01      2015     NaN    115 min

      listed_in \
5989      Movies
6827  Anime Series, International TV Shows
7312      Kids' TV, TV Comedies
7537      Dramas

      description
5989  Oprah Winfrey sits down with director Ava DuVe...
6827  After falling through a wormhole, a space-dwel...
7312  Adopting a child's perspective, this show take...
7537  Amid the chaos and horror of World War II, a c...
```

```
[ ]: netflix.loc[netflix_NaN_index, 'rating'] = "Not Available"
```

```
[ ]: netflix.loc[netflix_NaN_index]
```

```
[ ]:      show_id      type      title \
5989    s5990    Movie  13TH: A Conversation with Oprah Winfrey & Ava ...
6827    s6828  TV Show      Gargantia on the Verdurous Planet
```

|      |       |         |  |  |  |                      |
|------|-------|---------|--|--|--|----------------------|
| 7312 | s7313 | TV Show |  |  |  | Little Lunch         |
| 7537 | s7538 | Movie   |  |  |  | My Honor Was Loyalty |

|      | director        | cast \  |
|------|-----------------|---|
| 5989 | NaN             | Oprah Winfrey, Ava DuVernay                       |
| 6827 | NaN             | Kaito Ishikawa, Hisako Kanemoto, Ai Kayano, Ka... |
| 7312 | NaN             | Flynn Curry, Olivia Deeble, Madison Lu, Oisín ... |
| 7537 | Alessandro Pepe | Leone Frisa, Paolo Vaccarino, Francesco Miglio... |

|      | country   | date_added | release_year | rating        | duration \ |
|------|-----------|------------|--------------|---------------|------------|
| 5989 | NaN       | 2017-01-26 | 2017         | Not Available | 37 min     |
| 6827 | Japan     | 2016-12-01 | 2013         | Not Available | 1 Season   |
| 7312 | Australia | 2018-02-01 | 2015         | Not Available | 1 Season   |
| 7537 | Italy     | 2017-03-01 | 2015         | Not Available | 115 min    |

|      | listed_in \                          |
|------|--------------------------------------|
| 5989 | Movies                               |
| 6827 | Anime Series, International TV Shows |
| 7312 | Kids' TV, TV Comedies                |
| 7537 | Dramas                               |

|      | description                                       |
|------|---|
| 5989 | Oprah Winfrey sits down with director Ava DuVe... |
| 6827 | After falling through a wormhole, a space-dwel... |
| 7312 | Adopting a child's perspective, this show take... |
| 7537 | Amid the chaos and horror of World War II, a c... |

```
[ ]: netflix['rating'].unique()
```

```
[ ]: array(['PG-13', 'TV-MA', 'PG', 'TV-14', 'TV-PG', 'TV-Y', 'TV-Y7', 'R',
          'TV-G', 'G', 'NC-17', '74 min', '84 min', '66 min', 'NR',
          'Not Available', 'TV-Y7-FV', 'UR'], dtype=object)
```

Here we can see that rating has three unique values as minutes which should be in the duration field.

2.3)Cleaning Duration columns

## 11 4.3) Cleaning Duration Column

```
[ ]: netflix[netflix['duration'].isna()]
```

|      | show_id | type  | title                                | director \ |
|------|---------|-------|--------------------------------------|------------|
| 5541 | s5542   | Movie | Louis C.K. 2017                      | Louis C.K. |
| 5794 | s5795   | Movie | Louis C.K.: Hilarious                | Louis C.K. |
| 5813 | s5814   | Movie | Louis C.K.: Live at the Comedy Store | Louis C.K. |

|      | cast       | country       | date_added | release_year | rating | duration | \ |
|------|------------|---------------|------------|--------------|--------|----------|---|
| 5541 | Louis C.K. | United States | 2017-04-04 | 2017         | 74 min | NaN      |   |
| 5794 | Louis C.K. | United States | 2016-09-16 | 2010         | 84 min | NaN      |   |
| 5813 | Louis C.K. | United States | 2016-08-15 | 2015         | 66 min | NaN      |   |

|      | listed_in |   | description |
|------|-----------|---|-------------|
| 5541 | Movies    | Louis C.K. muses on religion, eternal love, gi... |             |
| 5794 | Movies    | Emmy-winning comedy writer Louis C.K. brings h... |             |
| 5813 | Movies    | The comic puts his trademark hilarious/thought... |             |

We have to update the values from rating to duration and also update the rating to Not available

```
[ ]: netflix_NaN_duration=netflix[netflix['duration'].isna()].index
```

```
[ ]: netflix.loc[netflix_NaN_duration,'duration']=netflix.  
      ↪loc[netflix_NaN_duration,'rating']
```

```
[ ]: netflix.loc[netflix_NaN_duration]
```

```
[ ]:      show_id  type                title  director \  
5541    s5542  Movie                Louis C.K. 2017  Louis C.K.  
5794    s5795  Movie                Louis C.K.: Hilarious  Louis C.K.  
5813    s5814  Movie  Louis C.K.: Live at the Comedy Store  Louis C.K.
```

|      | cast       | country       | date_added | release_year | rating | duration | \ |
|------|------------|---------------|------------|--------------|--------|----------|---|
| 5541 | Louis C.K. | United States | 2017-04-04 | 2017         | 74 min | 74 min   |   |
| 5794 | Louis C.K. | United States | 2016-09-16 | 2010         | 84 min | 84 min   |   |
| 5813 | Louis C.K. | United States | 2016-08-15 | 2015         | 66 min | 66 min   |   |

|      | listed_in |   | description |
|------|-----------|---|-------------|
| 5541 | Movies    | Louis C.K. muses on religion, eternal love, gi... |             |
| 5794 | Movies    | Emmy-winning comedy writer Louis C.K. brings h... |             |
| 5813 | Movies    | The comic puts his trademark hilarious/thought... |             |

Duration is updated

```
[ ]: netflix.loc[netflix_NaN_duration,'rating']="Not Available"
```

```
[ ]: netflix.loc[netflix_NaN_duration]
```

```
[ ]:      show_id  type                title  director \  
5541    s5542  Movie                Louis C.K. 2017  Louis C.K.  
5794    s5795  Movie                Louis C.K.: Hilarious  Louis C.K.  
5813    s5814  Movie  Louis C.K.: Live at the Comedy Store  Louis C.K.
```

|      | cast       | country       | date_added | release_year | rating        | \ |
|------|------------|---------------|------------|--------------|---------------|---|
| 5541 | Louis C.K. | United States | 2017-04-04 | 2017         | Not Available |   |
| 5794 | Louis C.K. | United States | 2016-09-16 | 2010         | Not Available |   |

5813 Louis C.K. United States 2016-08-15

2015 Not Available

|      | duration | listed_in |  | description                                       |
|------|----------|-----------|--|---|
| 5541 | 74 min   | Movies    |  | Louis C.K. muses on religion, eternal love, gi... |
| 5794 | 84 min   | Movies    |  | Emmy-winning comedy writer Louis C.K. brings h... |
| 5813 | 66 min   | Movies    |  | The comic puts his trademark hilarious/thought... |

```
[ ]: netflix['rating'].unique()
```

```
[ ]: array(['PG-13', 'TV-MA', 'PG', 'TV-14', 'TV-PG', 'TV-Y', 'TV-Y7', 'R',  
          'TV-G', 'G', 'NC-17', 'Not Available', 'NR', 'TV-Y7-FV', 'UR'],  
          dtype=object)
```

Rating field is updated

2.4) Cleaning director, cast and country

```
[ ]: netflix['director'] = netflix['director'].fillna('Not Available')  
netflix['cast'] = netflix['cast'].fillna('Not Available')  
netflix['country'] = netflix['country'].fillna('Not Available')
```

Lets check the null values again

```
[ ]: netflix.isna().sum()
```

```
[ ]: show_id      0  
type            0  
title          0  
director       0  
cast           0  
country        0  
date_added     0  
release_year   0  
rating         0  
duration       0  
listed_in      0  
description    0  
dtype: int64
```

Our dataset is cleaned up now

## 12 5) Exploring and Analysis of Data

```
[ ]: netflix['type'].unique()
```

```
[ ]: array(['Movie', 'TV Show'], dtype=object)
```

We can see that netflix has two types of videos. 1) Movies 2) TV Shows Let's make them two datasets to do better analysis

```
[ ]: movies=netflix.loc[netflix['type']=='Movie'].copy()
      movies.head()
```

```
[ ]:
      show_id  type                                     title \
0          s1  Movie                      Dick Johnson Is Dead
6          s7  Movie  My Little Pony: A New Generation
7          s8  Movie                      Sankofa
9         s10  Movie                      The Starling
12         s13  Movie                      Je Suis Karl

      director \
0          Kirsten Johnson
6  Robert Cullen, José Luis Ucha
7          Haile Gerima
9          Theodore Melfi
12         Christian Schwochow

      cast \
0          Not Available
6  Vanessa Hudgens, Kimiko Glenn, James Marsden, ...
7  Kofi Ghanaba, Oyafunmike Ogunlano, Alexandra D...
9  Melissa McCarthy, Chris O'Dowd, Kevin Kline, T...
12 Luna Wedler, Jannis Niewöhner, Milan Peschel, ...

      country date_added \
0          United States 2021-09-25
6          Not Available 2021-09-24
7  United States, Ghana, Burkina Faso, United Kin... 2021-09-24
9          United States 2021-09-24
12         Germany, Czech Republic 2021-09-23

      release_year rating duration \
0          2020  PG-13    90 min
6          2021    PG    91 min
7          1993  TV-MA   125 min
9          2021  PG-13   104 min
12         2021  TV-MA   127 min

      listed_in \
0          Documentaries
6          Children & Family Movies
7  Dramas, Independent Movies, International Movies
9          Comedies, Dramas
12         Dramas, International Movies
```

```

description
0 As her father nears the end of his life, filmm...
6 Equestria's divided. But a bright-eyed hero be...
7 On a photo shoot in Ghana, an American model s...
9 A woman adjusting to life after a loss contend...
12 After most of her family is murdered in a terr...

```

```
[ ]: tv_shows=netflix.loc[netflix['type']=='TV Show'].copy()
tv_shows.head()
```

```
[ ]: show_id    type          title    director \
1      s2  TV Show      Blood & Water    Not Available
2      s3  TV Show      Ganglands    Julien Leclercq
3      s4  TV Show  Jailbirds New Orleans    Not Available
4      s5  TV Show      Kota Factory    Not Available
5      s6  TV Show      Midnight Mass    Mike Flanagan

```

```

cast          country \
1 Ama Qamata, Khosi Ngema, Gail Mabalan...  South Africa
2 Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...  Not Available
3                                     Not Available  Not Available
4 Mayur More, Jitendra Kumar, Ranjan Raj, Alam K...  India
5 Kate Siegel, Zach Gilford, Hamish Linklater, H...  Not Available

```

```

date_added  release_year  rating  duration \
1 2021-09-24          2021  TV-MA  2 Seasons
2 2021-09-24          2021  TV-MA  1 Season
3 2021-09-24          2021  TV-MA  1 Season
4 2021-09-24          2021  TV-MA  2 Seasons
5 2021-09-24          2021  TV-MA  1 Season

```

```

listed_in \
1 International TV Shows, TV Dramas, TV Mysteries
2 Crime TV Shows, International TV Shows, TV Act...
3 Docuseries, Reality TV
4 International TV Shows, Romantic TV Shows, TV ...
5 TV Dramas, TV Horror, TV Mysteries

```

```

description
1 After crossing paths at a party, a Cape Town t...
2 To protect his family from a powerful drug lor...
3 Feuds, flirtations and toilet talk go down amo...
4 In a city of coaching centers known to train I...
5 The arrival of a charismatic young priest brin...

```

Since movie and TV shows both have different format for duration, we can change duration for

movies as minutes & TV shows as seasons

```
[ ]: movies['duration'] = movies['duration'].str[:-3]
     movies['duration'] = movies['duration'].astype('float')

[ ]: tv_shows['duration'] = tv_shows.duration.str[:-7].apply(lambda x : x.strip())
     tv_shows['duration'] = tv_shows['duration'].astype('float')

[ ]: tv_shows.rename({'duration': 'duration(seasons)'},axis = 1 , inplace = True)
     movies.rename({'duration': 'duration(minutes)'},axis = 1 , inplace = True)
```

Let's find out the when was first movie/TV Show added on netflix and when is the most recent movie added on netflix

```
[ ]: date_added_min=netflix['date_added'].min()
     date_added_max=netflix['date_added'].max()

[ ]: timeperiod=pd.DataFrame({'date_added':
    ↳[date_added_min,date_added_max]},index=['First Movie Added','Most Recent_
    ↳Movie Added'])
     timeperiod
```

```
[ ]:
     date_added
First Movie Added      2008-01-01
Most Recent Movie Added 2021-09-25
```

```
[ ]: releaseperiod=pd.DataFrame({'release_year':[netflix['release_year'].
    ↳min(),netflix['release_year'].max()]} ,index=['First Movie/TV Show Released_
    ↳Year','Most Recent Movie/TV Show Released Year'])
     releaseperiod
```

```
[ ]:
     release_year
First Movie/TV Show Released Year      1925
Most Recent Movie/TV Show Released Year 2021
```

Lets check Which are different ratings available on Netflix in each type of content? Check the number of content released in each type.

```
[ ]: netflix.groupby(['type','rating'])['show_id'].count()
```

```
[ ]: type    rating
     Movie    G          41
           NC-17         3
           NR          75
           Not Available  5
           PG         287
           PG-13       490
           R          797
```

|         |               |      |
|---------|---------------|------|
|         | TV-14         | 1427 |
|         | TV-G          | 126  |
|         | TV-MA         | 2062 |
|         | TV-PG         | 540  |
|         | TV-Y          | 131  |
|         | TV-Y7         | 139  |
|         | TV-Y7-FV      | 5    |
|         | UR            | 3    |
| TV Show | NR            | 4    |
|         | Not Available | 2    |
|         | R             | 2    |
|         | TV-14         | 730  |
|         | TV-G          | 94   |
|         | TV-MA         | 1143 |
|         | TV-PG         | 321  |
|         | TV-Y          | 175  |
|         | TV-Y7         | 194  |
|         | TV-Y7-FV      | 1    |

Name: show\_id, dtype: int64

Lets Check the distribution of movies produced in different countries

```
[ ]: netflix['country'].value_counts()
```

```
[ ]: country
United States                2812
India                        972
Not Available                 830
United Kingdom               418
Japan                        244
...
Romania, Bulgaria, Hungary    1
Uruguay, Guatemala            1
France, Senegal, Belgium      1
Mexico, United States, Spain, Colombia  1
United Arab Emirates, Jordan  1
Name: count, Length: 749, dtype: int64
```

We can see that many movies are produced in more than one country. To analyse movies produced in each country, we need to split them into different rows by using explode function

```
[ ]: country_table=netflix[['show_id','type','country']].copy()
country_table = country_table.drop(country_table[country_table['country'] == 'Not Available'].index)
country_table['country']=country_table['country'].apply(lambda x : x.split(','))
country_table=country_table.explode('country')
country_table
```



```
[ ]:      show_id      type      country
0         s1      Movie  United States
1         s2  TV Show   South Africa
4         s5  TV Show           India
7         s8      Movie  United States
7         s8      Movie           Ghana
...
8801    s8802      Movie           Jordan
8802    s8803      Movie  United States
8804    s8805      Movie  United States
8805    s8806      Movie  United States
8806    s8807      Movie           India
```

[10010 rows x 3 columns]

```
[ ]: # delete all rows with unnecessary spaces
country_table['country'] = country_table['country'].str.strip()
```

```
[ ]: country_table.loc[country_table['country'] == '']
country_table = country_table.loc[country_table['country'] != '']
country_table['country'].nunique()
```

```
[ ]: 122
```

Total 122 countries

Lets find out total Movies and TV Shows produced in each country:

```
[ ]: x = country_table.groupby(['country' , 'type'])['show_id'].count().reset_index()
x.pivot(index = ['country'] , columns = 'type' , values = 'show_id').
    ↪sort_values('Movie',ascending = False)
```

```
[ ]: type      Movie  TV Show
country
United States  2752.0    932.0
India          962.0     84.0
United Kingdom  534.0    271.0
Canada         319.0    126.0
France         303.0     90.0
...
Azerbaijan      NaN      1.0
Belarus          NaN      1.0
Cuba             NaN      1.0
Cyprus           NaN      1.0
Puerto Rico     NaN      1.0
```

[122 rows x 2 columns]

Lets do the same for director and cast column

```
[ ]: director_table=netflix[['show_id','type','director']].copy()
director_table = director_table.drop(director_table[director_table['director']_
↳== 'Not Available'].index)
director_table['director']=director_table['director'].apply(lambda x : x.
↳split(',')
director_table
```

```
[ ]:      show_id      type      director
0         s1      Movie      [Kirsten Johnson]
2         s3  TV Show      [Julien Leclercq]
5         s6  TV Show      [Mike Flanagan]
6         s7      Movie  [Robert Cullen, José Luis Ucha]
7         s8      Movie      [Haile Gerima]
...      ...      ...      ...
8801    s8802      Movie      [Majid Al Ansari]
8802    s8803      Movie      [David Fincher]
8804    s8805      Movie      [Ruben Fleischer]
8805    s8806      Movie      [Peter Hewitt]
8806    s8807      Movie      [Mozez Singh]
```

[6173 rows x 3 columns]

```
[ ]: director_table=director_table.explode('director')
director_table['director'] = director_table['director'].str.strip()
```

```
[ ]: director_table
```

```
[ ]:      show_id      type      director
0         s1      Movie      Kirsten Johnson
2         s3  TV Show      Julien Leclercq
5         s6  TV Show      Mike Flanagan
6         s7      Movie      Robert Cullen
6         s7      Movie      José Luis Ucha
...      ...      ...      ...
8801    s8802      Movie      Majid Al Ansari
8802    s8803      Movie      David Fincher
8804    s8805      Movie      Ruben Fleischer
8805    s8806      Movie      Peter Hewitt
8806    s8807      Movie      Mozez Singh
```

[6978 rows x 3 columns]

```
[ ]: director_table['director'].nunique()
```

```
[ ]: 4993
```

There are total 4993 unique directors in the dataset.

Lets find out total Movies and TV Shows directed by each director

```
[ ]: x = director_table.groupby(['director' , 'type'])['show_id'].count().
      ↪reset_index()
x.pivot(index= ['director'] , columns = 'type' , values = 'show_id').
      ↪sort_values('Movie' ,ascending = False)
```

```
[ ]: type                Movie  TV Show
director
Rajiv Chilaka           22.0      NaN
Jan Suter                21.0      NaN
Raúl Campos             19.0      NaN
Suhas Kadav              16.0      NaN
Marcus Raboy             15.0      1.0
...
Vijay S. Bhanushali      NaN      1.0
Wouter Bouvijn           NaN      1.0
YC Tom Lee               NaN      1.0
Yasuhiro Irie            NaN      1.0
Yim Pilsung              NaN      1.0
```

[4993 rows x 2 columns]

```
[ ]: cast_table = netflix[['show_id' , 'type' , 'cast']].copy()
cast_table=cast_table.drop(cast_table[cast_table['cast'] == 'Not Available'].
      ↪index)
cast_table['cast'] = cast_table['cast'].apply(lambda x : x.split(','))
cast_table = cast_table.explode('cast')
cast_table
```

```
[ ]:   show_id  type      cast
1      s2  TV Show    Ama Qamata
1      s2  TV Show    Khosi Ngema
1      s2  TV Show    Gail Mabalane
1      s2  TV Show    Thabang Molaba
1      s2  TV Show    Dillon Windvogel
...
8806  s8807  Movie    Manish Chaudhary
8806  s8807  Movie    Meghna Malik
8806  s8807  Movie    Malkeet Rauni
8806  s8807  Movie    Anita Shabdish
8806  s8807  Movie    Chittaranjan Tripathy
```

[64057 rows x 3 columns]

```
[ ]: cast_table['cast'] = cast_table['cast'].str.strip()
```

```
[ ]: cast_table['cast'].nunique()
```

```
[ ]: 36403
```

Lets find out total Movies and TV Shows acted by each cast

```
[ ]: x = cast_table.groupby(['cast' , 'type'])['show_id'].count().reset_index()
x.pivot(index = ['cast'] , columns = 'type' , values = 'show_id').
    ↪sort_values('Movie',ascending = False)
```

```
[ ]: type           Movie  TV Show
cast
Anupam Kher        42.0      1.0
Shah Rukh Khan     35.0      NaN
Naseeruddin Shah  32.0      NaN
Om Puri            30.0      NaN
Akshay Kumar       30.0      NaN
...
İpek Filiz Yazıcı  NaN       1.0
İsmail Filiz       NaN       1.0
Şafak Başkaya      NaN       1.0
Şehsuvar Aktaş     NaN       1.0
Şenay Gürler       NaN       1.0
```

[36403 rows x 2 columns]

```
[ ]: genre_table = netflix[['show_id' , 'type' , 'listed_in']].copy()
genre_table['listed_in'] = genre_table['listed_in'].apply(lambda x : x.
    ↪split(','))
genre_table = genre_table.explode('listed_in')
genre_table
```

```
[ ]:   show_id  type      listed_in
0      s1  Movie  Documentaries
1      s2 TV Show  International TV Shows
1      s2 TV Show      TV Dramas
1      s2 TV Show      TV Mysteries
2      s3 TV Show  Crime TV Shows
...
8805  s8806  Movie  Children & Family Movies
8805  s8806  Movie      Comedies
8806  s8807  Movie      Dramas
8806  s8807  Movie  International Movies
8806  s8807  Movie  Music & Musicals
```

[19303 rows x 3 columns]

```
[ ]: genre_table['listed_in'] = genre_table['listed_in'].str.strip()
```

```
[ ]: genre_table['listed_in'].nunique()
```

```
[ ]: 42
```

```
[ ]: x = genre_table.groupby(['listed_in' , 'type'])['show_id'].count().reset_index()  
x.pivot(index = 'listed_in' , columns = 'type' , values = 'show_id').  
    ↪sort_index()
```

```
[ ]: type
```

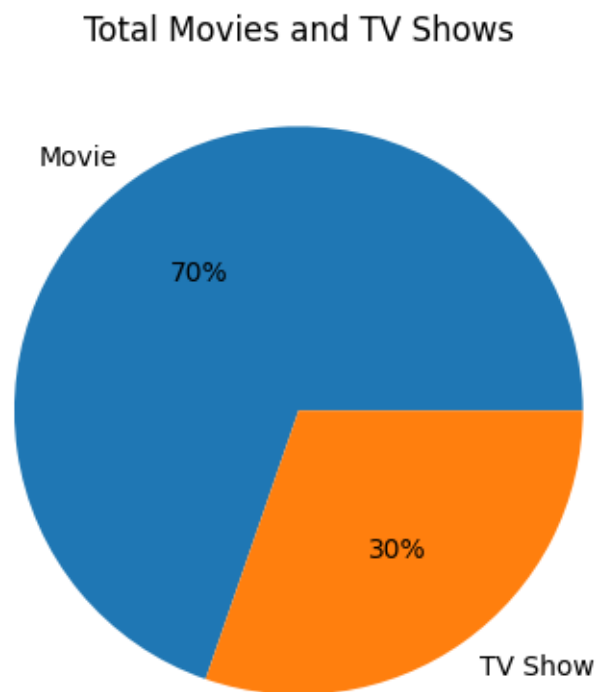
|                              | Movie  | TV Show |
|------------------------------|--------|---------|
| listed_in                    |        |         |
| Action & Adventure           | 859.0  | NaN     |
| Anime Features               | 71.0   | NaN     |
| Anime Series                 | NaN    | 175.0   |
| British TV Shows             | NaN    | 252.0   |
| Children & Family Movies     | 641.0  | NaN     |
| Classic & Cult TV            | NaN    | 26.0    |
| Classic Movies               | 116.0  | NaN     |
| Comedies                     | 1674.0 | NaN     |
| Crime TV Shows               | NaN    | 469.0   |
| Cult Movies                  | 71.0   | NaN     |
| Documentaries                | 869.0  | NaN     |
| Docuseries                   | NaN    | 394.0   |
| Dramas                       | 2427.0 | NaN     |
| Faith & Spirituality         | 65.0   | NaN     |
| Horror Movies                | 357.0  | NaN     |
| Independent Movies           | 756.0  | NaN     |
| International Movies         | 2752.0 | NaN     |
| International TV Shows       | NaN    | 1350.0  |
| Kids' TV                     | NaN    | 449.0   |
| Korean TV Shows              | NaN    | 151.0   |
| LGBTQ Movies                 | 102.0  | NaN     |
| Movies                       | 57.0   | NaN     |
| Music & Musicals             | 375.0  | NaN     |
| Reality TV                   | NaN    | 255.0   |
| Romantic Movies              | 616.0  | NaN     |
| Romantic TV Shows            | NaN    | 370.0   |
| Sci-Fi & Fantasy             | 243.0  | NaN     |
| Science & Nature TV          | NaN    | 92.0    |
| Spanish-Language TV Shows    | NaN    | 173.0   |
| Sports Movies                | 219.0  | NaN     |
| Stand-Up Comedy              | 343.0  | NaN     |
| Stand-Up Comedy & Talk Shows | NaN    | 56.0    |
| TV Action & Adventure        | NaN    | 167.0   |
| TV Comedies                  | NaN    | 574.0   |
| TV Dramas                    | NaN    | 762.0   |

|                     |       |      |
|---------------------|-------|------|
| TV Horror           | NaN   | 75.0 |
| TV Mysteries        | NaN   | 98.0 |
| TV Sci-Fi & Fantasy | NaN   | 83.0 |
| TV Shows            | NaN   | 16.0 |
| TV Thrillers        | NaN   | 57.0 |
| Teen TV Shows       | NaN   | 69.0 |
| Thrillers           | 577.0 | NaN  |

## 13 6) Visual Analysis

Let's check the distribution of content across types

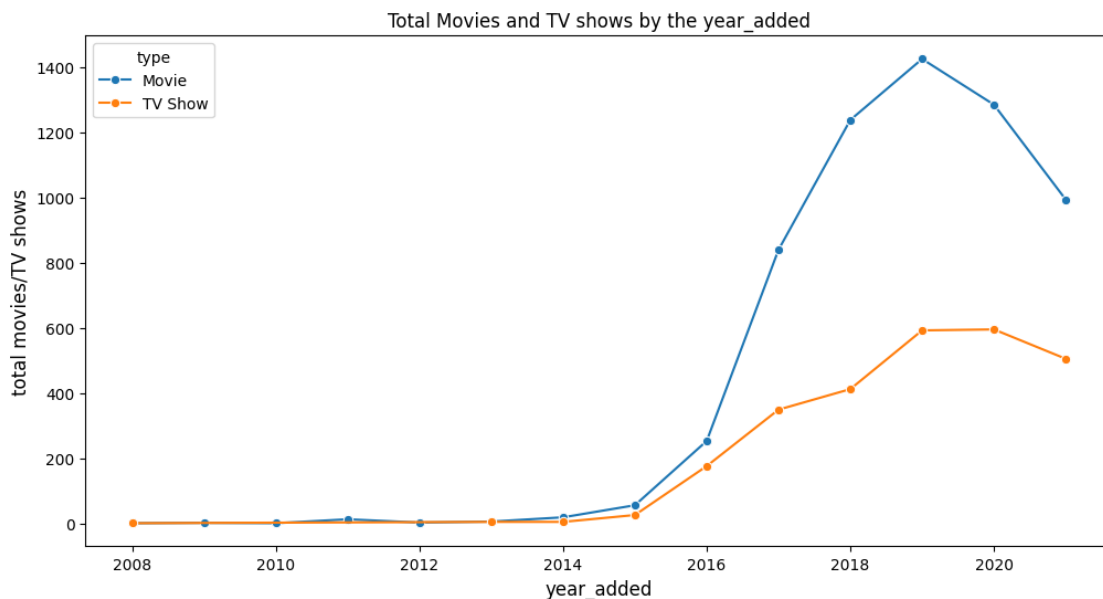
```
[ ]: types=netflix['type'].value_counts()
plt.pie(types, labels=types.index, autopct='%1.0f%%')
plt.title('Total Movies and TV Shows')
plt.show()
```



70% of Netflix content is Movies and 30% of content is TV Shows

```
[ ]: netflix['year_added'] = netflix['date_added'].dt.year
```

```
[ ]: # How has the number of movies/TV shows added on Netflix per year changed over
      ↳ the time?
d = netflix.groupby(['year_added' , 'type' ])[ 'show_id' ].count().reset_index()
d.rename({'show_id' : 'total movies/TV shows'}, axis = 1 , inplace = True)
plt.figure(figsize = (12,6))
sns.lineplot(data = d , x = 'year_added' , y = 'total movies/TV shows' , hue = 'type' , marker = 'o' , ms = 6)
plt.xlabel('year_added' , fontsize = 12)
plt.ylabel('total movies/TV shows' , fontsize = 12)
plt.title('Total Movies and TV shows by the year_added' , fontsize = 12)
plt.show()
```



The content added on the Netflix surged drastically after 2015.

2019 marks the highest number of movies and TV shows added on the Netflix.

Year 2020 and 2021 has seen the drop in content added on Netflix, possibly because of Pandemic.

But still , TV shows content have not dropped as drastic as movies. In recent years TV shows are focussed more than Movies.

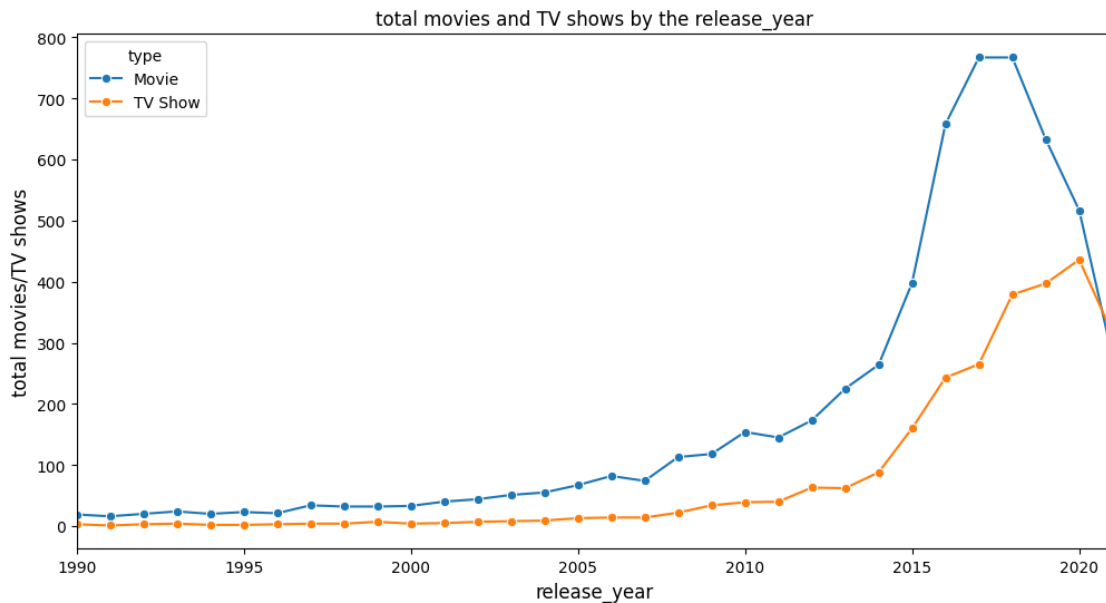
```
[ ]: d = netflix.groupby(['type' , 'release_year'])[ 'show_id' ].count().reset_index()
d.rename({'show_id' : 'total movies/TV shows'}, axis = 1 , inplace = True)
d
```

```
[ ]:      type  release_year  total movies/TV shows
0      Movie           1942                2
1      Movie           1943                3
2      Movie           1944                3
```

|     |         |      |     |
|-----|---------|------|-----|
| 3   | Movie   | 1945 | 3   |
| 4   | Movie   | 1946 | 1   |
| ..  | ...     | ...  | ... |
| 114 | TV Show | 2017 | 265 |
| 115 | TV Show | 2018 | 379 |
| 116 | TV Show | 2019 | 397 |
| 117 | TV Show | 2020 | 436 |
| 118 | TV Show | 2021 | 315 |

[119 rows x 3 columns]

```
[ ]: plt.figure(figsize = (12,6))
sns.lineplot(data = d , x = 'release_year' , y = 'total movies/TV shows' , hue_
    ⇨ = 'type' , marker = 'o' , ms = 6 )
plt.xlabel('release_year' , fontsize = 12)
plt.ylabel('total movies/TV shows' , fontsize = 12)
plt.title('total movies and TV shows by the release_year' , fontsize = 12)
plt.xlim( left = 1990 , right = 2021)
plt.show()
```



**2018** marks the highest number of movie and TV show releases.

Since 2018, A drop in movies is seen and rise in TV shows is observed clearly, and TV shows surpasses the movies count in mid 2020.

In recent years TV shows are focussed more than Movies.

The yearly number of releases has surged drastically from 2015.



```
[ ]: tv_shows.head()
```

```
[ ]:  show_id      type      title      director \
1      s2  TV Show      Blood & Water      Not Available
2      s3  TV Show      Ganglands      Julien Leclercq
3      s4  TV Show  Jailbirds New Orleans      Not Available
4      s5  TV Show      Kota Factory      Not Available
5      s6  TV Show      Midnight Mass      Mike Flanagan

      cast      country \
1  Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...  South Africa
2  Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...  Not Available
3                                     Not Available  Not Available
4  Mayur More, Jitendra Kumar, Ranjan Raj, Alam K...  India
5  Kate Siegel, Zach Gilford, Hamish Linklater, H...  Not Available

      date_added  release_year  rating  duration(seasons) \
1  2021-09-24      2021  TV-MA      2.0
2  2021-09-24      2021  TV-MA      1.0
3  2021-09-24      2021  TV-MA      1.0
4  2021-09-24      2021  TV-MA      2.0
5  2021-09-24      2021  TV-MA      1.0

      listed_in \
1  International TV Shows, TV Dramas, TV Mysteries
2  Crime TV Shows, International TV Shows, TV Act...
3  Docuseries, Reality TV
4  International TV Shows, Romantic TV Shows, TV ...
5  TV Dramas, TV Horror, TV Mysteries

      description
1  After crossing paths at a party, a Cape Town t...
2  To protect his family from a powerful drug lor...
3  Feuds, flirtations and toilet talk go down amo...
4  In a city of coaching centers known to train I...
5  The arrival of a charismatic young priest brin...
```

```
[ ]: tv_shows['day']=pd.to_datetime(tv_shows['date_added']).dt.day_name()
movies['day']=pd.to_datetime(movies['date_added']).dt.day_name()
```

```
[ ]: tv_counts = tv_shows['day'].value_counts()
movies_counts = movies['day'].value_counts()
country=tv_shows['country'].value_counts()

# Create subplots
fig, ax = plt.subplots(1, 2, figsize=(12, 5))
```

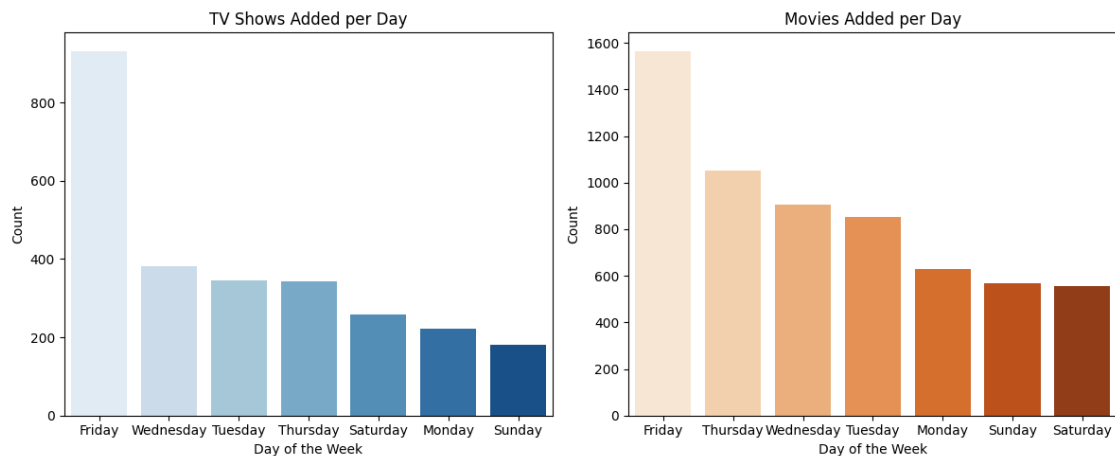
```

# TV Shows subplot
sns.barplot(x=tv_counts.index, y=tv_counts.values, ax=ax[0], hue=tv_counts.
    ↪index, palette='Blues', legend=False)
ax[0].set_title("TV Shows Added per Day")
ax[0].set_xlabel("Day of the Week")
ax[0].set_ylabel("Count")

# Movies subplot
sns.barplot(x=movies_counts.index, y=movies_counts.values, ax=ax[1],
    ↪hue=movies_counts.index, palette='Oranges', legend=False)
ax[1].set_title("Movies Added per Day")
ax[1].set_xlabel("Day of the Week")
ax[1].set_ylabel("Count")

plt.tight_layout()
plt.show()

```



It is seen that most of the TV Shows and Movies are released on Fridays

```

[ ]: # Lets check for top 10 countries
top_10_country = country_table['country'].value_counts().head(10).index
df_new = country_table.loc[country_table['country'].isin(top_10_country)]

[ ]: x = df_new.groupby(['country' , 'type'])['show_id'].count().reset_index()
x.pivot(index = 'country' , columns = 'type' , values = 'show_id').
    ↪sort_values('Movie',ascending = False)

```

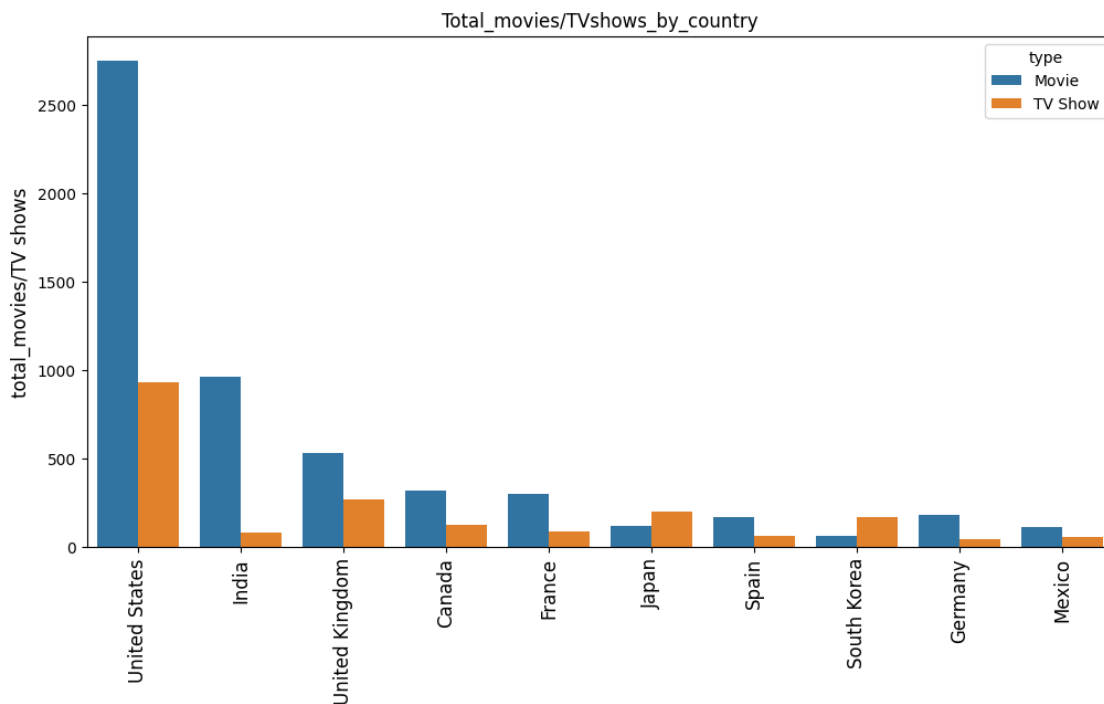
```

[ ]: type      Movie  TV Show
country
United States  2752    932
India          962     84

```

|                |     |     |
|----------------|-----|-----|
| United Kingdom | 534 | 271 |
| Canada         | 319 | 126 |
| France         | 303 | 90  |
| Germany        | 182 | 44  |
| Spain          | 171 | 61  |
| Japan          | 119 | 198 |
| Mexico         | 111 | 58  |
| South Korea    | 61  | 170 |

```
[ ]: plt.figure(figsize= (12,6))
sns.countplot(data = df_new , x = 'country' , order = top_10_country , hue = 'type')
plt.xticks(rotation = 90 , fontsize = 12)
plt.ylabel('total_movies/TV shows' , fontsize = 12)
plt.xlabel('')
plt.title('Total_movies/TVshows_by_country')
plt.show()
```



United States is leading the table with most contents on Netflix

```
[83]: # Get the top 10 countries
top_10_country = country_table['country'].value_counts().head(10).index

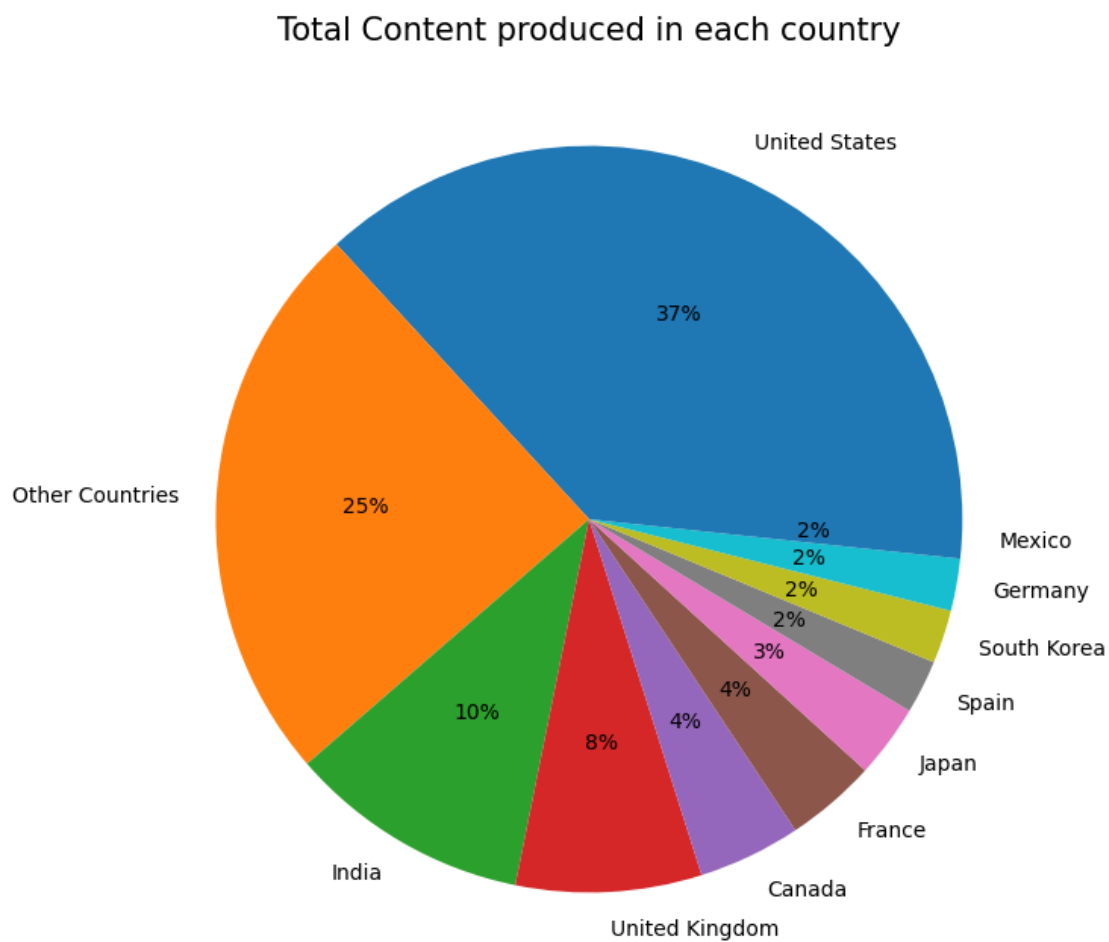
# Explicitly create a copy of the DataFrame
```

```
country_table = country_table.copy()

# Create a new column 'cat' and assign values
country_table['cat'] = country_table['country'].apply(lambda x: x if x in top_10_country else 'Other Countries')
```

```
[84]: x = country_table['cat'].value_counts()

plt.figure(figsize = (8,8))
plt.pie(x , labels = x.index, autopct='%1.0f%%')
plt.title('Total Content produced in each country' , fontsize = 15)
plt.show()
```



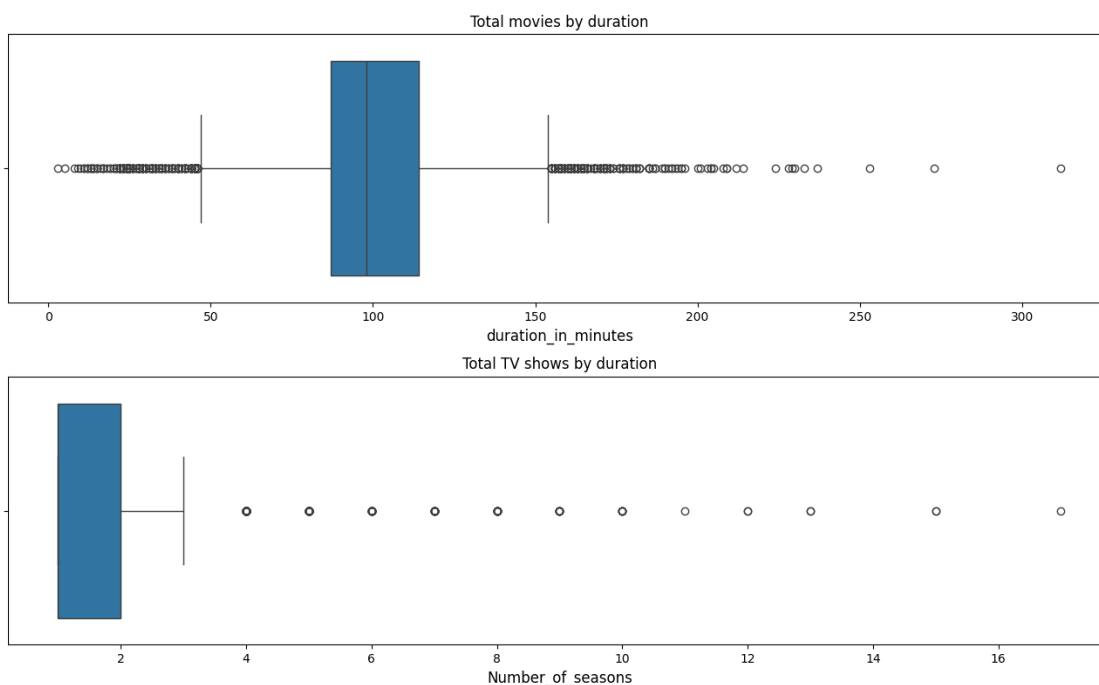
Movies and TV Shows Distribution over duration

```
[ ]: fig, ax = plt.subplots(2,1, figsize=(13,8))

sns.boxplot (data = movies , x = 'duration(minutes)' ,ax =ax[0])
ax[0].set_xlabel('duration_in_minutes' , fontsize = 12)
ax[0].set_title('Total movies by duration')

sns.boxplot (data = tv_shows , x = 'duration(seasons)' , ax = ax[1])
ax[1].set_xlabel('Number_of_seasons' , fontsize = 12)
ax[1].set_title('Total TV shows by duration')

plt.tight_layout()
plt.show()
```

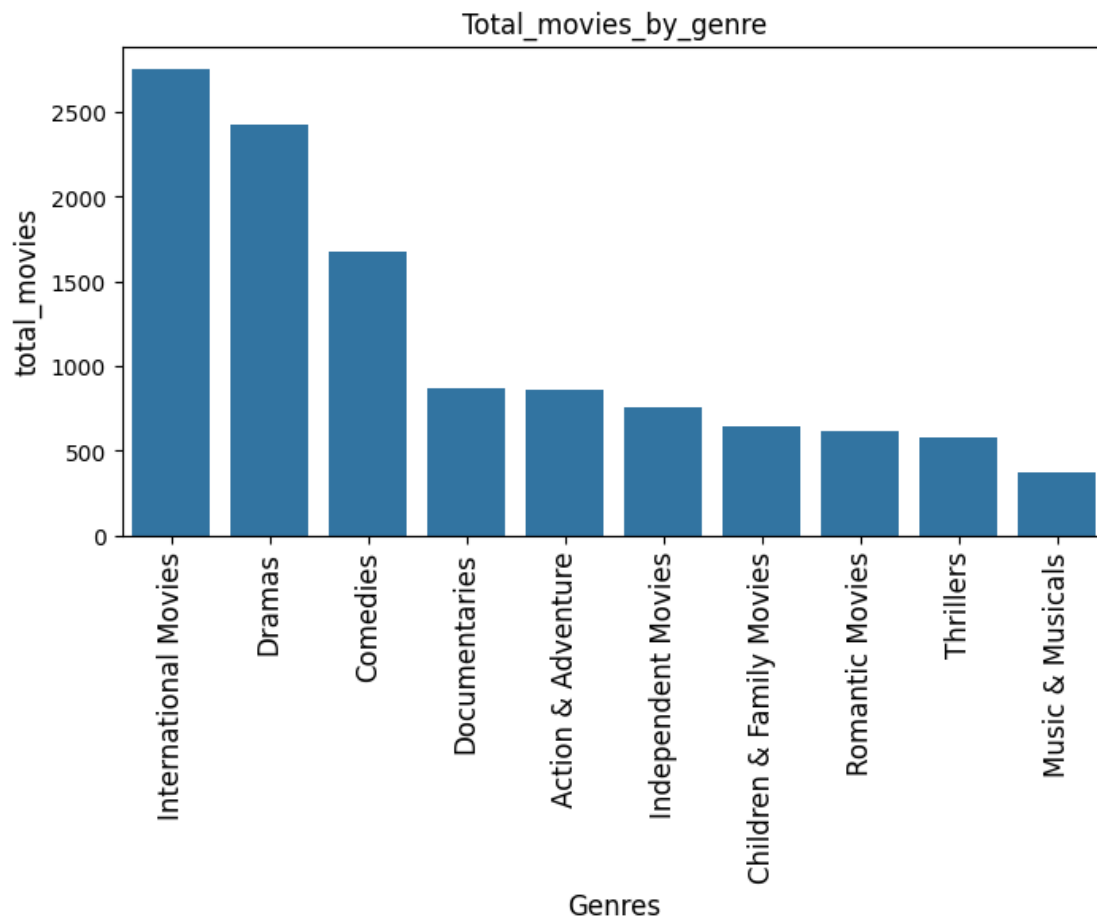


- **Movie Duration:** 50 mins - 150 mins is the range excluding potential outliers (values lying outside the whiskers of boxplot)
- **TV Show Duration:** 1-3 seasons is the range for TV shows excluding potential outliers

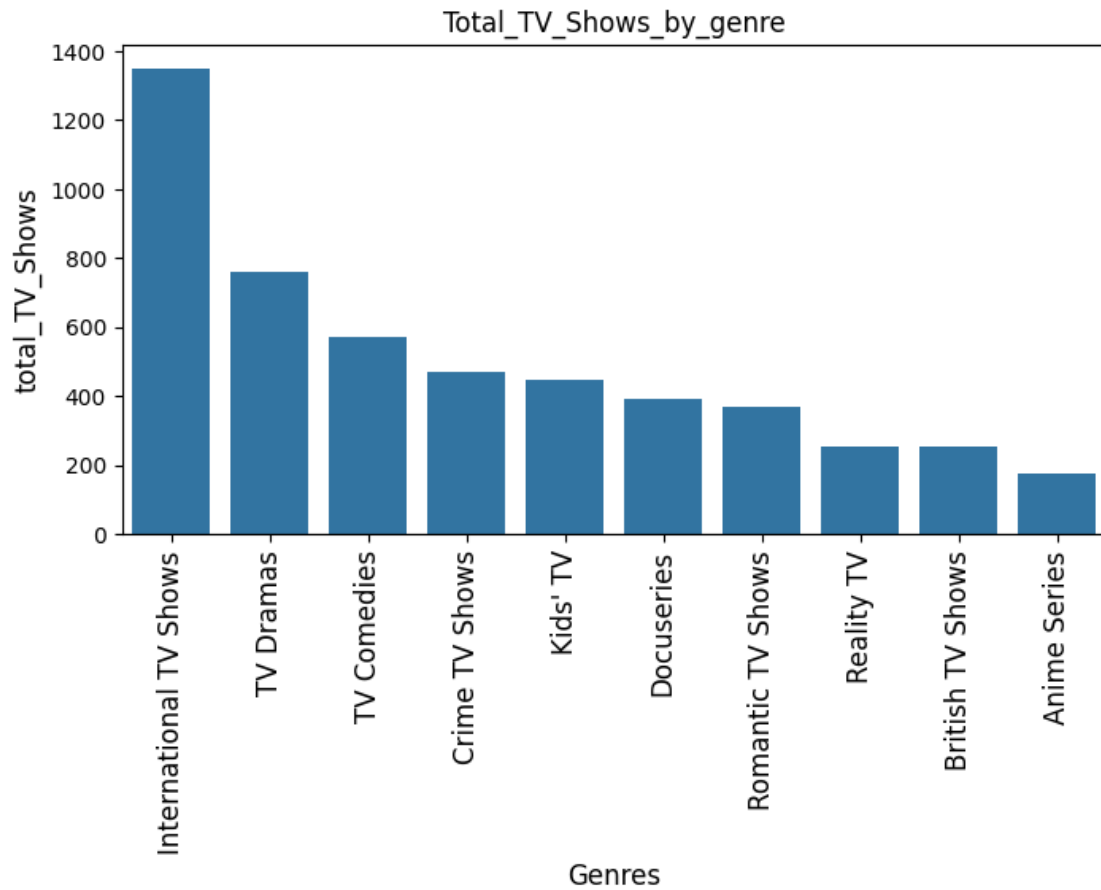
```
[ ]: top_10_movie_genres = genre_table[genre_table['type'] == 'Movie'].listed_in.
    ↪value_counts().head(10).index
df_movie = genre_table.loc[genre_table['listed_in'].isin(top_10_movie_genres)]

[ ]: top_10_TV_genres = genre_table[genre_table['type'] == 'TV Show'].listed_in.
    ↪value_counts().head(10).index
df_tv = genre_table.loc[genre_table['listed_in'].isin(top_10_TV_genres)]
```

```
[ ]: plt.figure(figsize= (8,4))
sns.countplot(data = df_movie , x = 'listed_in' , order = top_10_movie_genres)
plt.xticks(rotation = 90 , fontsize = 12)
plt.ylabel('total_movies' , fontsize = 12)
plt.xlabel('Genres' , fontsize = 12)
plt.title('Total_movies_by_genre')
plt.show()
```

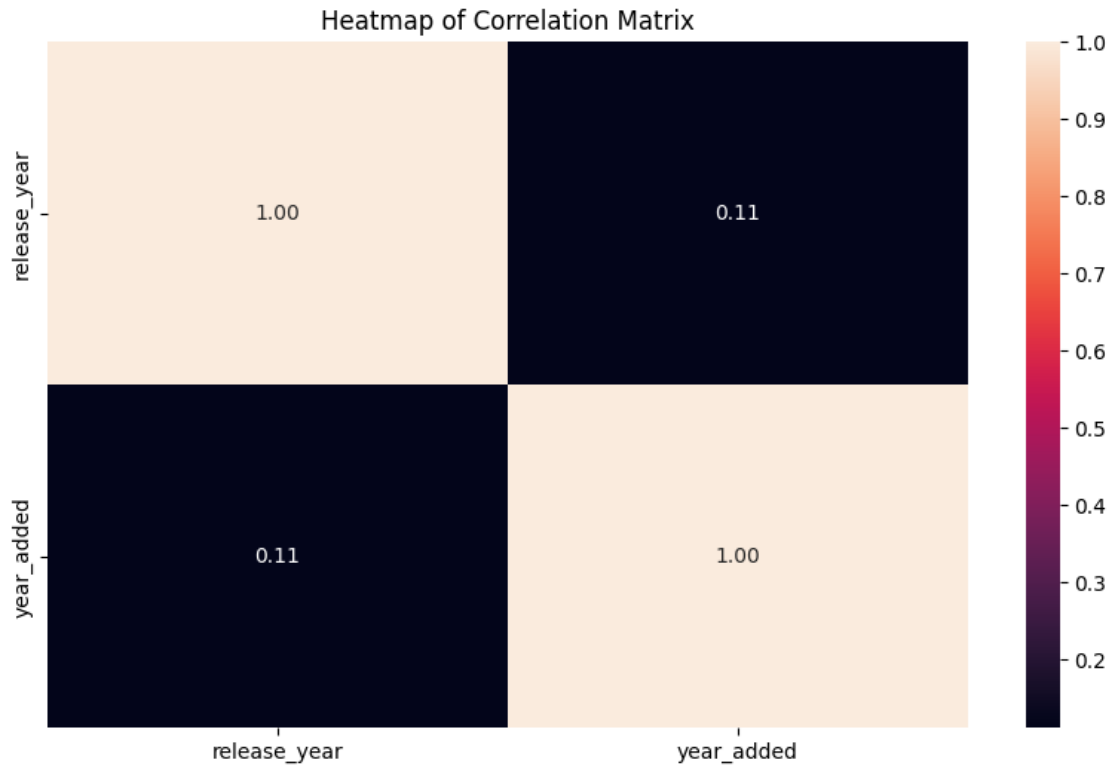


```
[ ]: plt.figure(figsize= (8,4))
sns.countplot(data = df_tv , x = 'listed_in' ,order = top_10_TV_genres)
plt.xticks(rotation = 90 , fontsize = 12)
plt.ylabel('total_TV_Shows' , fontsize = 12)
plt.xlabel('Genres' , fontsize = 12)
plt.title('Total_TV_Shows_by_genre')
plt.show()
```



```
[ ]: df_numeric = netflix.select_dtypes(include=['number'])
      corr_matrix = df_numeric.corr()

      plt.figure(figsize=(10, 6))
      sns.heatmap(corr_matrix, annot=True, fmt=".2f")
      plt.title("Heatmap of Correlation Matrix")
      plt.show()
```



### Weak Correlation (0.11) Between Release Year and Year Added:

The low correlation (0.11) suggests that there is no strong relationship between when a movie/TV show was released and when it was added to the platform.

### Content is Not Immediately Added After Release:

Since the correlation is weak, Netflix does not necessarily add content close to its release year. Instead, older content is also frequently added.

### Netflix's Licensing and Acquisition Strategy is Diverse:

The low correlation indicates that Netflix adds content based on factors other than just release year, such as licensing agreements, audience demand, and strategic partnerships.

## 14 7)Outlier Treatment

```
[ ]: num_cols = ['release_year']

[ ]: df = netflix.dropna(subset=num_cols)

[ ]: def remove_outliers_iqr(data, column):
    Q1 = data[column].quantile(0.25)
    Q3 = data[column].quantile(0.75)
```



```

IQR = Q3 - Q1
lower_bound = Q1 - 1.5 * IQR
upper_bound = Q3 + 1.5 * IQR
return data[(data[column] >= lower_bound) & (data[column] <= upper_bound)]

```

```

[ ]: def remove_outliers_zscore(data, column, threshold=3):
    mean = data[column].mean()
    std = data[column].std()
    return data[np.abs((data[column] - mean) / std) < threshold]

```

```

[ ]: df_iqr = remove_outliers_iqr(netflix, 'release_year')
df_zscore = remove_outliers_zscore(netflix, 'release_year')

```

```

[ ]: plt.figure(figsize=(12, 5))

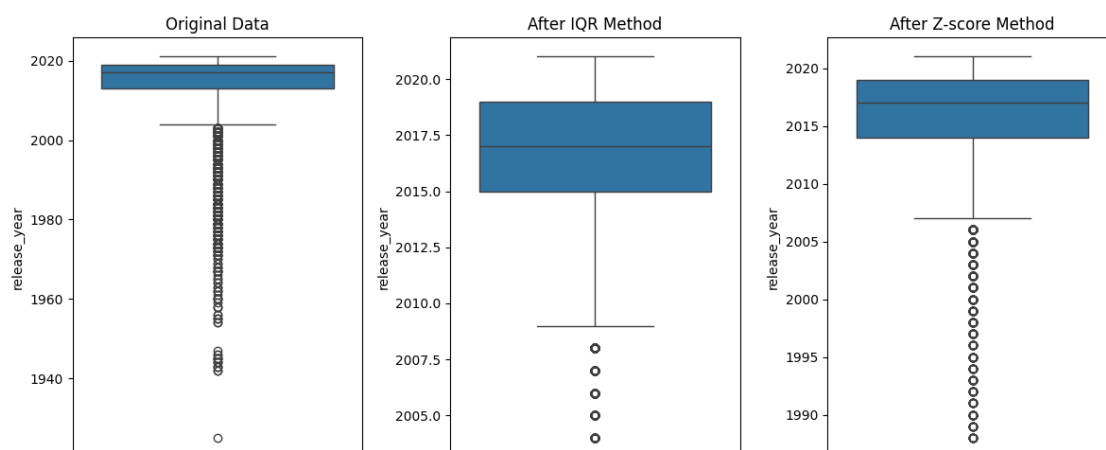
plt.subplot(1, 3, 1)
sns.boxplot(y=netflix['release_year'])
plt.title("Original Data")

plt.subplot(1, 3, 2)
sns.boxplot(y=df_iqr['release_year'])
plt.title("After IQR Method")

plt.subplot(1, 3, 3)
sns.boxplot(y=df_zscore['release_year'])
plt.title("After Z-score Method")

plt.tight_layout()
plt.show()

```



IQR is better for skewed distributions since it focuses on the middle 50% of data.

Z-score works well when data is normally distributed, as it relies on standard deviation.

Final choice depends on business needs—IQR is robust, while Z-score can be useful for symmetrical data

## 15 Insights based on Non-Graphical and Visual Analysis

1. Movies dominate Netflix content (~70%), while TV shows make up ~30%. Since 2015, TV shows have surged, surpassing movies in mid-2020.
2. Content growth peaked in 2019, with a decline in 2020-21, likely due to the pandemic. TV shows remained more stable compared to movies.
3. Diverse global content—Netflix hosts movies/shows from 122 countries, with the U.S. contributing 37%. India has the most actors featured.
4. Content ratings vary by region—TV-MA is the most common, while kid-friendly ratings are more prevalent in the U.S.
5. Top genres include International Movies/TV Shows, Dramas, and Comedies, with region-specific trends (e.g., Korean TV Shows in Korea, Anime in Japan).
6. Viewing preferences have evolved—Recent years show a preference for shorter-duration movies (50-150 mins) and TV shows with 1-3 seasons.

## 16 Business Insights

1. **Limited Pre-2000 Content:** The majority of Netflix’s catalog consists of post-2000 releases. Older content is scarce, presenting an opportunity to target senior citizens with classic films and shows.
2. **Focus on Mature Audiences :** Over 80% of Netflix content is rated TV-MA, TV-14, TV-PG, or R, catering primarily to mature viewers and children with parental guidance. Expanding kid-friendly or all-age content could attract a broader audience.
3. **Genre Trends:** International Movies/TV Shows, Dramas, Comedies, Action & Adventure, and Thrillers are the most popular genres, highlighting strong global and entertainment-driven content preferences.
4. **Content Source Concentration:** 75% of Netflix content comes from just 10 countries, while the rest of the world contributes only 25%. Expanding content from underrepresented regions could drive growth and diversification.
5. **Preference for Shorter Content :** Viewers favor movies between 75-150 minutes and TV shows with 1-3 seasons. New content production should align with this trend to maximize engagement.
6. **Pandemic Impact on Content:** A noticeable drop in content additions in 2020-2021 across all countries, likely due to the pandemic, suggests a temporary slowdown in production and acquisitions.

## 17 Recommendations

1. **Shift from Movies to TV Shows** : Netflix initially had 2.3x more movies than TV shows (6131 vs. 2676). However, in the past five years, the movie proportion has dropped from ~75% to ~47%, while TV shows have surged from ~25% to ~53%. This shift indicates a growing demand for episodic content over standalone films.
2. **Gaps in Audience Targeting** : Around 80% of Netflix content caters to mature audiences (TV-MA, TV-14, TV-PG) or children with parental guidance. Expanding content for families, senior citizens, and kids of various age groups could unlock new audience segments.
3. **Growing Preference for Shorter Content** : In the last decade, viewers have shown a clear preference for movies lasting 75-150 minutes and TV series with 1-3 seasons. Aligning new productions with this trend could enhance engagement.
4. **Scarcity of Pre-2000 Content** : Most of Netflix's library consists of content released after 2000, with very little older content available. Senior citizens, who may seek classic films and TV shows, are currently an underserved audience.
5. **Need for Regional Genre Expansion** : Netflix content is heavily US-centric, with limited genre variety in most countries. Introducing country-specific genres (e.g., Indian Mythological content or Japanese Anime) could drive local and global interest, just as anime has gained worldwide popularity.
6. **\*\* Country-Specific Content Strategies\*\*** : Content distribution should align with a country's demographic needs.

For example:

**India** : Mostly serves TV-MA, TV-14, and TV-PG content, which may not cater to kids under 14 and adults over 35.

**Japan** : Serves mainly TV-MA, TV-14, and TV-PG, despite having a large aging population (60+ years). Increasing age-appropriate content could better serve this demographic.

7. **Content Source Concentration** : 75% of Netflix's library comes from just 10 countries, with the United States, India, and the UK as top contributors. Expanding content from underrepresented regions with relevant genres and ratings could fuel global growth.

#The link to the colab file

[https://colab.research.google.com/drive/1iSQQNaeqo5zandvpRY6TgwOW2\\_PVb8Px?usp=sharing](https://colab.research.google.com/drive/1iSQQNaeqo5zandvpRY6TgwOW2_PVb8Px?usp=sharing)

[ ]: