Exploratory Data Analytics on Netflix Data

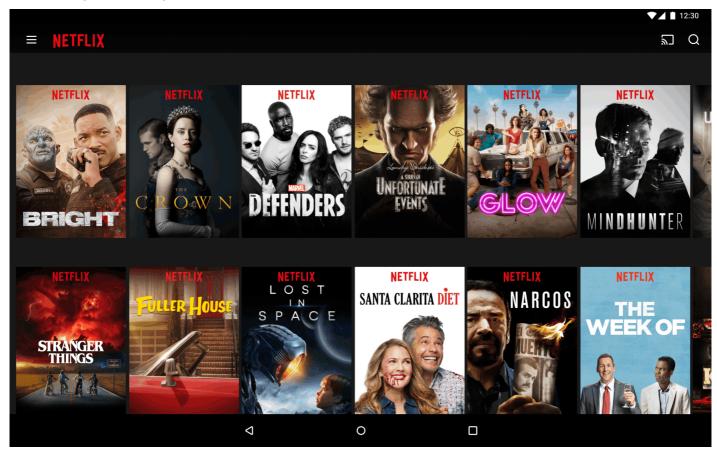


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1. Data Decription:

This Netflix Dataset has information about the TV shows and Movies available on Netflix from the year 2008 to 2021. Netflix is an application that keeps growing exponentially whole around the world and it is the most famous streaming platform. This dataset also available on kaggle website for free.

This dataset collected from Netflix of different TV shows and Movies from the year 2008 to 2021.

- chow id: Civos the information about show id

- type: Gives information about 2 different unique values one is TV Show and another is Movie.
- . title: Gives information about the title of Movie or TV Show
- director: Gives information about the director who directed the Movie or TV Show
- · cast: Gives information about the cast who plays role in Movie or TV Show.
- . country: Gives information about the Name of country.
- date_added: Gives information about the tv shows or movie released.
- release_year: Gives information about the year when Movie or TV Show was released.
- rating: Gives information about the Movie or TV Show are in which category (eg like the movies are only for students, or adults, etc).
- duration: Gives information about the duration of Movie or TV Show.
- listed_in: Gives information about the genre of Movie or TV Show.
- description: Gives information about the description of Movie or TV Show.

1.1. Introduction

This Exploratory Data Analysis is to practice Python skills learned till now on a structured data set including loading, inspecting, wrangling, exploring, and drawing conclusions from data. The notebook has observations with each step in order to explain thoroughly how to approach the data set. Based on the observation some questions also are answered in the notebook for the reference though not all of them are explored in the analysis.

1.2 Data source and data set

This Netflix Dataset has information about the TV shows and Movies available on Netflix from 2018 to 2021. This dataset collected from kaggle website for free.

• Dataset link: https://www.kaggle.com/datasets/swatikhedekar/exploratory-data-analysis-on-netflix-data (https://www.kaggle.com/datasets/swatikhedekar/exploratory-data-analysis-on-netflix-data (https://www.kaggle.com/datasets/swatikhedekar/exploratory-data-analysis-on-netflix-data (https://www.kaggle.com/datasets/swatikhedekar/exploratory-data-analysis-on-netflix-data (https://www.kaggle.com/datasets/swatikhedekar/exploratory-data-analysis-on-netflix-data (https://www.kaggle.com/datasets/swatikhedekar/exploratory-data-analysis-on-netflix-data (https://www.kaggle.com/datasets/swatikhedekar/exploratory-data-analysis-on-netflix-data">https://www.kaggle.com/datasets/swatikhedekar/exploratory-data-analysis-on-netflix-data (https://www.kaggle.com/datasets/swatikhedekar/exploratory-data-analysis-on-netflix-data (https://www.kaggle.com/datasets/swatikhedekar/exploratory-data-analysis-on-netflix-data (<a href="https://www.kaggle.com/datasets/swatikhedekar/exploratory-datasets/swatikhedekar/exploratory-datasets/swatikhedekar/exploratory-datasets/swatikhedekar/exploratory-datasets/swatikhedekar/exploratory-datasets/swatik

2. Load the Packages and Data

Import libraries or modules

```
In [1]:
```

CPU times: total: 9.59 s Wall time: 36.3 s

Load the dataset

```
In [2]:
```

```
netflix = pd.read_csv(r"F:\FSDA\live\python1\12_jan_netflix\netflix_titles_21.csv")
```

3.Data Profiling (Data Exploration)

3.1 Understanding the Dataset(Basic information about dataset)

In [3]:

netflix.head() # for shows top 5 rows

Out[3]:

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

In [4]:

netflix.tail() # For bottom 5 rows

Out[4]:

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

In [5]:

netflix.shape # to show the total no. of columns and rows

Out[5]:

(8807, 12)

This dataset contains 8807 rows and 12 columns.

In [6]:

```
netflix.size # to show the total no. of volume(elements)
```

Out[6]:

105684

In [7]:

```
netflix.columns # to shows each column name
```

Out[7]:

```
In [8]:
```

```
netflix.dtypes
                    # to shows data types each column name
Out[8]:
show_id
                object
type
                object
title
                object
director
                object
cast
                object
country
                object
date_added
                object
release_year
                 int64
rating
                object
duration
                object
listed_in
                object
description
                object
dtype: object
```

In [9]:

netflix.info() # to shows indexes,data types each column name

<class 'pandas.core.frame.DataFrame'> RangeIndex: 8807 entries, 0 to 8806 Data columns (total 12 columns): Non-Null Count Dtype Column ---8807 non-null 0 show_id object 8807 non-null 1 type object 8807 non-null 2 title object 3 6173 non-null director object 4 7982 non-null cast object 5 country 7976 non-null object ${\tt date_added}$ 8797 non-null 6 object release_year 8807 non-null 7 int64 8 rating 8803 non-null object 9 duration 8804 non-null object 10 listed_in 8807 non-null object 11 description 8807 non-null object

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

In [10]:

netflix.describe() # for shows statistical information

Out[10]:

```
        count
        8807.000000

        mean
        2014.180198

        std
        8.819312

        min
        1925.00000

        25%
        2013.00000

        50%
        2017.00000

        75%
        2019.00000

        max
        2021.000000
```

In [11]:

netflix.describe(include='all')

Out[11]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|--------|---------|-------|----------------------------|------------------|-----------------------|------------------|--------------------|--------------|-----------|-------------|------------------------------------|--|
| count | 8807 | 8807 | 8807 | 6173 | 7982 | 7976 | 8797 | 8807.000000 | 8803 | 8804 | 8807 | 8807 |
| unique | 8807 | 2 | 8807 | 4528 | 7692 | 748 | 1767 | NaN | 17 | 220 | 514 | 8775 |
| top | s1 | Movie | Dick Johnson Is Dead | Rajiv Chilaka | David Attenborough | United States | January 1, 2020 | NaN | TV- MA | 1 Season | Dramas, International Movies | Paranormal activity at a lush, abandoned prope |
| freq | 1 | 6131 | 1 | 19 | 19 | 2818 | 109 | NaN | 3207 | 1793 | 362 | 4 |
| mean | NaN | NaN | NaN | NaN | NaN | NaN | NaN | 2014.180198 | NaN | NaN | NaN | NaN |
| std | NaN | NaN | NaN | NaN | NaN | NaN | NaN | 8.819312 | NaN | NaN | NaN | NaN |
| min | NaN | NaN | NaN | NaN | NaN | NaN | NaN | 1925.000000 | NaN | NaN | NaN | NaN |
| 25% | NaN | NaN | NaN | NaN | NaN | NaN | NaN | 2013.000000 | NaN | NaN | NaN | NaN |
| 50% | NaN | NaN | NaN | NaN | NaN | NaN | NaN | 2017.000000 | NaN | NaN | NaN | NaN |
| 75% | NaN | NaN | NaN | NaN | NaN | NaN | NaN | 2019.000000 | NaN | NaN | NaN | NaN |
| max | NaN | NaN | NaN | NaN | NaN | NaN | NaN | 2021.000000 | NaN | NaN | NaN | NaN |

In [12]:

```
#Finding how many unique values are in the dataset netflix.nunique()
```

Out[12]:

show_id 8807 type 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

Data Preperation(Data Cleaning)

- · Check missing values
- · Fill null values

In [13]:

netflix.isnull()

to shows where the null values is present

Out[13]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|------|---------|-------|-------|----------|-------|---------|------------|--------------|--------|----------|-----------|-------------|
| 0 | False | False | False | False | True | False | False | False | False | False | False | False |
| 1 | False | False | False | True | False | False | False | False | False | False | False | False |
| 2 | False | False | False | False | False | True | False | False | False | False | False | False |
| 3 | False | False | False | True | True | True | False | False | False | False | False | False |
| 4 | False | False | False | True | False | False | False | False | False | False | False | False |
| | | | | | | | | | | | | |
| 8802 | False | False | False | False | False | False | False | False | False | False | False | False |
| 8803 | False | False | False | True | True | True | False | False | False | False | False | False |
| 8804 | False | False | False | False | False | False | False | False | False | False | False | False |
| 8805 | False | False | False | False | False | False | False | False | False | False | False | False |
| 8806 | False | False | False | False | False | False | False | False | False | False | False | False |

8807 rows × 12 columns

In [14]:

miss=netflix.isnull().sum() # to shows the count of null values
miss

Out[14]:

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

In [15]:

```
miss1 = (netflix.isnull().sum()/len(netflix))* 100
miss1
Out[15]:
show_id
                 0.000000
type
                 0.000000
title
                 0.000000
director
                29.908028
cast
                 9.367549
country
                 9.435676
date_added
                 0.113546
release_year
                 0.000000
rating
                 0.045418
duration
                 0.034064
listed_in
                 0.000000
                 0.000000
description
dtype: float64
In [16]:
```

```
#missing values with %
m = pd.concat([miss,miss1],axis=1,keys=['Total','%'])
m
```

Out[16]:

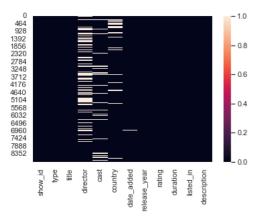
| | Total | % |
|--|------------------|--|
| show_id | 0 | 0.000000 |
| type | 0 | 0.000000 |
| title | 0 | 0.000000 |
| director | 2634 | 29.908028 |
| cast | 825 | 9.367549 |
| country | 831 | 9.435676 |
| date_added | 10 | 0.113546 |
| release_year | 0 | 0.000000 |
| rating | 4 | 0.045418 |
| duration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

In [17]:

```
sns.heatmap(netflix.isnull()) # using heatmap to shows the null value count
```

Out[17]:

<AxesSubplot:>



- From the above output we can see that director , cast ,country columns contains maximum null values. We will see how to deal with them.
- So, We Delete director and cast columns because they are not going to use those features right now.

In [18]:

```
# making copy of dataset for changes
netflix_copy = netflix.copy()
netflix_copy.head()
```

Out[18]:

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

In [19]:

```
netflix_copy =netflix_copy.dropna(how='any',subset=['director','cast'])
netflix_copy.head(2)
```

Out[19]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|---|---------|------------|------------------|--------------------|---|---------|-----------------------|--------------|-----------|-------------|--|--|
| 2 | s3 | TV Show | Ganglands | Julien Leclercq | Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi | NaN | September 24, 2021 | 2021 | TV- MA | 1 Season | Crime TV Shows, International TV Shows, TV Act | To protect his family from a powerful drug lor |
| 5 | s6 | TV Show | Midnight Mass | Mike Flanagan | Kate Siegel, Zach Gilford, Hamish Linklater, H | NaN | September 24, 2021 | 2021 | TV- MA | 1 Season | TV Dramas, TV Horror, TV Mysteries | The arrival of a charismatic young priest brin |

In [20]:

```
netflix_copy.fillna({'country':'missing','rating':'missing'},inplace=True)
```

In [21]:

```
netflix_copy.isnull().sum()
```

Out[21]:

0 show_id 0 type title 0 director 0 cast country date_added 0 0 release_year 0 rating duration 3 listed_in 0 description 0 dtype: int64

3.2 Pre-Profiling

pip install -U pandas profiling

In [22]:

```
Defaulting to user installation because normal site-packages is not writeable
Requirement already satisfied: pandas_profiling in c:\users\user\appdata\roaming\python\python39\site-packages (3.6.2)
Requirement already satisfied: scipy<1.10,>=1.4.1 in f:\my apps\anaconda\lib\site-packages (from pandas_profiling)
(1.7.3)
Requirement already satisfied: htmlmin==0.1.12 in c:\users\user\appdata\roaming\python\python39\site-packages (from pandas_
profiling) (0.1.12)
Requirement already satisfied: pydantic<1.11,>=1.8.1 in c:\users\user\appdata\roaming\python\python39\site-packages (from p
andas_profiling) (1.10.4)
Requirement already satisfied: PyYAML<6.1,>=5.0.0 in f:\my apps\anaconda\conda\lib\site-packages (from pandas_profiling)
Requirement already satisfied: phik<0.13,>=0.11.1 in c:\users\user\appdata\roaming\python\python39\site-packages (from pand
as_profiling) (0.12.3)
Requirement already satisfied: requests<2.29,>=2.24.0 in f:\my apps\anaconda\conda\lib\site-packages (from pandas_profilin
g) (2.27.1)
Requirement already satisfied: multimethod<1.10,>=1.4 in c:\user\user\appdata\roaming\python\python39\site-packages (from
pandas_profiling) (1.9.1)
Requirement already satisfied: pandas!=1.4.0,<1.6,>1.1 in f:\my apps\anaconda\conda\lib\site-packages (from pandas profilin
g) (1.4.2)
Requirement already satisfied: tqdm<4.65,>=4.48.2 in f:\my apps\anaconda\conda\lib\site-packages (from pandas profiling)
(4.64.0)
Requirement already satisfied: typeguard<2.14,>=2.13.2 in c:\users\user\appdata\roaming\python\python39\site-packages (from
pandas_profiling) (2.13.3)
Requirement already satisfied: seaborn < 0.13, >= 0.10.1 in f: \verb|my apps|| anaconda|| to be site-packages (from pandas_profiling)| for the satisfied of the s
(0.11.2)
Requirement already satisfied: numpy<1.24,>=1.16.0 in f:\my apps\anaconda\lib\site-packages (from pandas profiling)
(1.21.5)
Requirement already satisfied: statsmodels<0.14,>=0.13.2 in f:\my apps\anaconda\conda\lib\site-packages (from pandas_profil
ing) (0.13.2)
Requirement already satisfied: visions[type\_image\_path] == 0.7.5 in c: \users \user \approx \begin{center} c: \users \user \approx \
es (from pandas_profiling) (0.7.5)
Requirement already satisfied: matplotlib<3.7,>=3.2 in f:\my apps\anaconda\conda\lib\site-packages (from pandas_profiling)
(3.5.1)
Requirement already satisfied: jinja2<3.2,>=2.11.1 in f:\my apps\anaconda\conda\lib\site-packages (from pandas_profiling)
(2.11.3)
Requirement already satisfied: networkx>=2.4 in f:\my apps\anaconda\lib\site-packages (from visions[type_image_path]=
=0.7.5->pandas_profiling) (2.7.1)
Requirement already satisfied: tangled-up-in-unicode>=0.0.4 in c:\users\user\appdata\roaming\python\python39\site-packages
(from visions[type_image_path]==0.7.5->pandas_profiling) (0.2.0)
Requirement already satisfied: attrs>=19.3.0 in f:\my apps\anaconda\conda\lib\site-packages (from visions[type_image_path]=
=0.7.5->pandas_profiling) (21.4.0)
Requirement already satisfied: imagehash in c:\users\user\appdata\roaming\python\python39\site-packages (from visions[type_
image_path]==0.7.5->pandas_profiling) (4.3.1)
Requirement already satisfied: Pillow in f:\my apps\anaconda\conda\lib\site-packages (from visions[type_image_path]==0.7.5-
>pandas_profiling) (9.0.1)
Requirement already satisfied: MarkupSafe>=0.23 in f:\my apps\anaconda\conda\lib\site-packages (from jinja2<3.2,>=2.11.1->p
andas_profiling) (2.0.1)
Requirement already satisfied: fonttools>=4.22.0 in f:\my apps\anaconda\conda\lib\site-packages (from matplotlib<3.7,>=3.2-
>pandas profiling) (4.25.0)
Requirement already satisfied: kiwisolver>=1.0.1 in f:\my apps\anaconda\conda\lib\site-packages (from matplotlib<3.7,>=3.2-
>pandas_profiling) (1.3.2)
Requirement already satisfied: pyparsing>=2.2.1 in f:\my apps\anaconda\conda\lib\site-packages (from matplotlib<3.7,>=3.2->
pandas_profiling) (3.0.4)
Requirement already satisfied: python-dateutil>=2.7 in f:\my apps\anaconda\conda\lib\site-packages (from matplotlib<3.7,>=
3.2->pandas_profiling) (2.8.2)
Requirement already satisfied: cycler>=0.10 in f:\my apps\anaconda\conda\lib\site-packages (from matplotlib<3.7,>=3.2->pand
as_profiling) (0.11.0)
Requirement already satisfied: packaging>=20.0 in f:\my apps\anaconda\conda\lib\site-packages (from matplotlib<3.7,>=3.2->p
andas_profiling) (21.3)
Requirement already satisfied: pytz>=2020.1 in c: \users \user \appdata \noaming \python \appdata \end{substitute} in c: \users \appdata \noaming \python \appdata \end{substitute} in c: \users \appdata \noaming \appdata \appda
4.0,<1.6,>1.1->pandas_profiling) (2022.7.1)
Requirement already satisfied: joblib>=0.14.1 in f:\my apps\anaconda\conda\lib\site-packages (from phik<0.13,>=0.11.1->pand
as_profiling) (1.1.0)
Requirement already satisfied: typing-extensions>=4.2.0 in c:\user\appdata\roaming\python\python39\site-packages (fro
m pydantic<1.11,>=1.8.1->pandas_profiling) (4.4.0)
Requirement already satisfied: six>=1.5 in f:\my apps\anaconda\conda\lib\site-packages (from python-dateutil>=2.7->matplotl
ib<3.7,>=3.2->pandas_profiling) (1.16.0)
Requirement already satisfied: certifi>=2017.4.17 in f:\my apps\anaconda\lib\site-packages (from requests<2.29,>=2.2
4.0->pandas_profiling) (2021.10.8)
Requirement already satisfied: urllib3<1.27,>=1.21.1 in f:\mbox{$m$ apps\anaconda\lib\site-packages (from requests<2.29,>=1.21.1)} in f:\mbox{$m$ apps\anaconda\lib\site-pac
2.24.0->pandas_profiling) (1.26.9)
Requirement already satisfied: charset-normalizer~=2.0.0 in f:\my apps\anaconda\conda\lib\site-packages (from requests<2.2
9,>=2.24.0->pandas_profiling) (2.0.4)
Requirement already satisfied: idna<4,>=2.5 in f:\my apps\anaconda\conda\lib\site-packages (from requests<2.29,>=2.24.0->pa
ndas_profiling) (3.3)
Requirement already satisfied: patsy>=0.5.2 in f:\my apps\anaconda\conda\lib\site-packages (from statsmodels<0.14,>=0.13.2-
>pandas_profiling) (0.5.2)
Requirement already satisfied: colorama in f:\my apps\anaconda\conda\lib\site-packages (from tqdm<4.65,>=4.48.2->pandas_pro
filing) (0.4.4)
Requirement already satisfied: PyWavelets in f:\my apps\anaconda\conda\lib\site-packages (from imagehash->visions[type_imag
e path]==0.7.5->pandas profiling) (1.3.0)
Note: you may need to restart the kernel to use updated packages.
```

Now performing pandas profiling to understand data better.

```
In [23]:
```

netflix_profile = prf.ProfileReport(netflix)
netflix_profile

Summarize dataset: 100%

23/23 [00:22<00:00, 1.83it/s, Completed]

Generate report structure: 100%

1/1 [00:12<00:00, 12.23s/it]

Render HTML: 100%

1/1 [00:05<00:00, 5.77s/it]

description has a high cardinality: 8775 distinct values High cardinality director has 2634 (29.9%) missing values Missing cast has 825 (9.4%) missing values Missing country has 831 (9.4%) missing values Missing show_id is uniformly distributed Uniform title is uniformly distributed Uniform director is uniformly distributed Uniform cast is uniformly distributed Uniform description is uniformly distributed Uniform show_id has unique values Unique title has unique values Unique

Reproduction

| Analysis started | 2023-01-24 17:21:30.730460 |
|------------------------|--|
| Analysis finished | 2023-01-24 17:21:52.466452 |
| Duration | 21.74 seconds |
| Software version | pandas-profiling vv3.6.2 (https://github.com/pandas-profiling/pandas-profiling) |
| Download configuration | config.json (data:text/plain;charset=utf-8,%7B%22title%22%3A%20%22Pandas%20Profiling%20Report%22%2C%20%22dataset%22%3A%20%7B%2 |

Variables

Out[23]:

In [24]:

```
netflix_profile.to_file(output_file="netflix21_before_preprocessing.html")
```

Export report to file: 100%

1/1 [00:00<00:00, 3.64it/s]

3.3 Preprocessing

- Dealing with duplicate rows
>
 - Find number of duplicate rows in the dataset.
 - Print the duplicate entries and analyze.
 - Drop the duplicate entries from the dataset.
-

In [25]:

netflix[netflix.duplicated()] # to shows the dupbicate rows

Out[25]:

show_id type title director cast country date_added release_year rating duration listed_in description

In [26]:

netflix.duplicated().sum() # to shows the count of dupbicate rows

Out[26]:

0

* No duplicate rows are present in this dataset.

4.EDA Questions

4.1. What different types of show or movie are uploaded on Netflix? or ### How many TV shows & Movies are in the dataset? Show with Bar Gragh?

In [27]:

netflix_copy.head(2)

Out[27]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|---|---------|------------|------------------|--------------------|---|---------|-----------------------|--------------|-----------|-------------|--|--|
| 2 | s3 | TV Show | Ganglands | Julien Leclercq | Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi | missing | September 24, 2021 | 2021 | TV- MA | 1 Season | Crime TV Shows, International TV Shows, TV Act | To protect his family from a powerful drug lor |
| 5 | s6 | TV Show | Midnight Mass | Mike Flanagan | Kate Siegel, Zach Gilford, Hamish Linklater, H | missing | September 24, 2021 | 2021 | TV- MA | 1 Season | TV Dramas, TV Horror, TV Mysteries | The arrival of a charismatic young priest brin |

In [28]:

method-1:
netflix_copy.groupby('type')['title'].count().sort_values(ascending = False)

Out[28]:

type

Movie 5522

TV Show 178 Name: title, dtype: int64

In [29]:

method-2:

netflix_copy.type.value_counts().to_frame('Value_count')

Out[29]:

| | Value_count |
|---------|-------------|
| Movie | 5522 |
| TV Show | 178 |

In [30]:

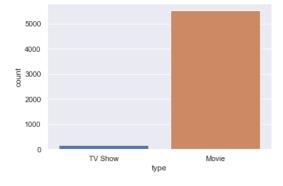
sns.countplot(netflix_copy['type'])# to show the count of all uniqu item of a any column in the form og bargragp

F:\my apps\anaconda\conda\lib\site-packages\seaborn_decorators.py:36: FutureWarning: Pass the following variable as a keyw ord arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an ex plicit keyword will result in an error or misinterpretation.

warnings.warn(

Out[30]:

<AxesSubplot:xlabel='type', ylabel='count'>



Obeservation: There are **5522-types** of movies and **178-types** of tv shows are uploaded on Netflix.

4.2 What is the Correlation between the features?

In [31]:

netflix_copy.dtypes

Out[31]:

show_id object type object title object director object cast object country object date_added object release_year int64 rating object duration object listed_in object description object dtype: object

- Converting object into datetime formate of "date_added"

In [32]:

netflix_copy["date_added"]=pd.to_datetime(netflix_copy['date_added'])
netflix_copy.head(2)

Out[32]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|---|---------|------------|------------------|--------------------|---|---------|------------|--------------|-----------|-------------|--|--|
| 2 | s3 | TV Show | Ganglands | Julien Leclercq | Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | Crime TV Shows, International TV Shows, TV Act | To protect his family from a powerful drug lor |
| 5 | s6 | TV Show | Midnight Mass | Mike Flanagan | Kate Siegel, Zach Gilford, Hamish Linklater, H | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | TV Dramas, TV Horror, TV Mysteries | The arrival of a charismatic young priest brin |

• Now ,we create two features year_added and month_added from date_added column.

In [33]:

```
netflix_copy['year_added'] = netflix_copy["date_added"].dt.year
netflix_copy['month_added'] = netflix_copy["date_added"].dt.month
netflix_copy.head(2)
```

Out[33]:

| she | ow_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description | year_added | month_added |
|-----|-------|------------|------------------|--------------------|--|---------|------------|--------------|-----------|-------------|--|--|------------|-------------|
| 2 | s3 | TV Show | Ganglands | Julien Leclercq | Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | Crime TV Shows, International TV Shows, TV Act | To protect his family from a powerful drug lor | 2021 | 9 |
| 5 | s6 | TV Show | Midnight Mass | Mike Flanagan | Kate Siegel, Zach Gilford, Hamish Linklater, H | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | TV Dramas, TV Horror, TV Mysteries | The arrival of a charismatic young priest brin | 2021 | 9 |

In [34]:

```
netflix_copy.dtypes
```

Out[34]:

show_id object type object title object director object cast object country object date_added datetime64[ns] release_year int64 rating object duration object listed_in object description object year_added int64 month_added int64 dtype: object

In [35]:

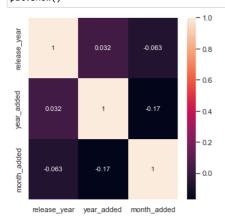
netflix_copy.corr()

Out[35]:

| | release_year | year_added | month_added |
|--------------|--------------|------------|-------------|
| release_year | 1.000000 | 0.032265 | -0.062903 |
| year_added | 0.032265 | 1.000000 | -0.170078 |
| month added | -0.062003 | -0 170078 | 1 000000 |

In [36]:

```
plt.subplots(figsize=(5,5))
sns.heatmap(netflix_copy.corr(),annot=True)
plt.show()
```



Obeservation : Above Heatmap shows correlation between release_year,year_added & month_added.

4.3 Most watched shows on the Netflix?

In [37]:

netflix_copy.type.value_counts().to_frame('Value_count')

Out[37]:

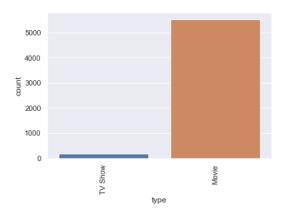
| | Value_count |
|---------|-------------|
| Movie | 5522 |
| TV Show | 178 |

In [38]:

```
sns.countplot(x=netflix_copy['type'],orient='v')
plt.xticks(rotation=90)
```

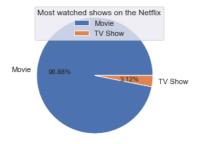
Out[38]:

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



In [39]:

```
# by using Pie chart
type_show = ['Movie','TV Show']
Value_count = [5522,178]
plt.pie(Value_count,labels=type_show,autopct="%2.2f%%")
plt.legend(title='Most watched shows on the Netflix')
plt.show()
```



Obeservation: Audience likes to watched mostly **movies(96.88%) ** over **TV shows(3.12%)**.

4.4 Distribution of Ratings? & ### What are the different rating defined by Netflix?

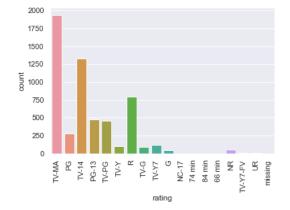
In [40]:

netflix_copy.head(2)

Out[40]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description | year_added | month_added |
|---|---------|------------|------------------|--------------------|--|---------|------------|--------------|-----------|-------------|--|--|------------|-------------|
| 2 | s3 | TV Show | Ganglands | Julien Leclercq | Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | Crime TV Shows, International TV Shows, TV Act | To protect his family from a powerful drug lor | 2021 | 9 |
| 5 | s6 | TV Show | Midnight Mass | Mike Flanagan | Kate Siegel, Zach Gilford, Hamish Linklater, H | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | TV Dramas, TV Horror, TV Mysteries | The arrival of a charismatic young priest brin | 2021 | 9 |
| 4 | | | | | | | | | | | | | | |

In [41]:



In [42]:

```
netflix['rating'].nunique()
```

Out[42]:

17

Obeservation: - Audience prefers mostly TV-MA & TV-14 and less prefers NC-17 as rating. - There are 17 types of ratings in the netflix.

4.5 Which has the highest rating Tv show or Movies?

In [43]:

netflix_copy.head(2)

Out[43]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description | year_added | month_added |
|---|---------|------------|------------------|--------------------|--|---------|------------|--------------|-----------|-------------|--|--|------------|-------------|
| 2 | s3 | TV Show | Ganglands | Julien Leclercq | Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | Crime TV Shows, International TV Shows, TV Act | To protect his family from a powerful drug lor | 2021 | 9 |
| 5 | s6 | TV Show | Midnight Mass | Mike Flanagan | Kate Siegel, Zach Gilford, Hamish Linklater, H | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | TV Dramas, TV Horror, TV Mysteries | The arrival of a charismatic young priest brin | 2021 | 9 |

```
In [44]:
netflix.groupby("type")["rating"].agg(pd.Series.mode)
Out[44]:
type
Movie
             TV-MA
TV Show
            TV-MA
Name: rating, dtype: object
#### Adding new feature
new_genre (Genre 1,Genre 2,Genre 3)
In [45]:
new_genre = netflix_copy['listed_in'].str.split(",",2)
new_genre
Out[45]:
2
         [Crime TV Shows, International TV Shows, TV ...
5
                      [TV Dramas, TV Horror, TV Mysteries]
6
                                    [Children & Family Movies]
         [Dramas, Independent Movies, International M...
[British TV Shows, Reality TV]
7
8
8801
                [Dramas, International Movies, Thrillers]
8802
                          [Cult Movies, Dramas, Thrillers]
8804
                                   [Comedies, Horror Movies]
8805
                       [Children & Family Movies, Comedies]
         [Dramas, International Movies, Music & Music...
8806
Name: listed_in, Length: 5700, dtype: object
In [46]:
netflix_copy['Genre 1'] = new_genre.str.get(0)
netflix_copy['Genre 2'] = new_genre.str.get(1)
netflix_copy['Genre 3'] = new_genre.str.get(2)
netflix_copy.head(2)
Out[46]:
    show id type
                        title
                              director
                                          cast country date added release year rating duration
                                                                                                  listed in description year added month added
                                          Sami
                                       Bouajila,
                                                                                                  Crime TV
                                                                                                             To protect
                                         Tracv
                                                                                                    Shows.
                                                                                                              his family
               TV
                                Julien
 2
         s3 Show
                   Ganglands
                                        Gotoas,
                                                missing
                                                        2021-09-24
                                                                          2021
                                                                                                International
                                                                                                                from a
                                                                                                                             2021
                                                                                                                                             9
                              Leclercq
                                        Samuel
                                                                                                 TV Shows.
                                                                                                              powerful
                                          Jouy,
                                                                                                   TV Act...
                                                                                                              drug lor...
                                         Nabi.
                                          Kate
                                        Siegel,
Zach
                                                                                                             The arrival
                                                                                                TV Dramas
               TV
                     Midnight
                                                                                                  TV Horror,
                                                missing 2021-09-24
 5
         s6
                                        Gilford
                                                                          2021
                                                                                                            charismatic
                                                                                                                             2021
                                                                                                                                             9
            Show
                       Mass
                             Flanagan
                                                                                  MA
                                                                                        Season
                                        Hamish
                                                                                                                young
                                                                                                  Mysteries
                                       Linklater.
                                                                                                            priest brin.
4
In [47]:
netflix_copy['Genre 1'].describe(include=all)
Out[47]:
count
              5700
unique
                33
top
            Dramas
              1586
freq
Name: Genre 1, dtype: object
In [48]:
netflix_copy['Genre 2'].describe(include=all)
Out[48]:
count
                               4485
unique
                                 35
             International Movies
top
freq
Name: Genre 2, dtype: object
```

```
1/24/23, 11:59 PM
                                                               EDA on Netflix data 2021 - Jupyter Notebook
  In [49]:
 netflix_copy['Genre 3'].describe(include=all)
 Out[49]:
                             2434
  count
  unique
                               29
  top
             International Movies
  freq
                              881
  Name: Genre 3, dtype: object
  - drop listed_in column because not need
  In [50]:
  netflix_copy.drop('listed_in',axis = 1,inplace = True)
 netflix_copy.head(2)
  Out[50]:
```

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | description | year_added | month_added | Genre 1 | |
|---|---------|------------|------------------|--------------------|--|---------|------------|--------------|-----------|-------------|--|------------|-------------|----------------------|-------------|
| 2 | s3 | TV Show | Ganglands | Julien Leclercq | Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | To protect his family from a powerful drug lor | 2021 | 9 | Crime TV Shows | Int |
| 5 | s6 | TV Show | Midnight Mass | Mike Flanagan | Kate Siegel, Zach Gilford, Hamish Linklater, H | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | The arrival of a charismatic young priest brin | 2021 | 9 | TV Dramas | |
| | | | | | | | | | | | | | | | > |

In [51]:

netflix_copy.duplicated().sum()

Out[51]:

0

In [52]:

netflix_copy.groupby(['Genre 1'])['release_year'].count().sort_values(ascending = False)

Out[52]: Genre 1

```
Dramas
                                 1586
Comedies
                                 1184
Action & Adventure
                                  848
Children & Family Movies
                                  548
Documentaries
                                  397
Stand-Up Comedy
                                  309
Horror Movies
                                  274
International Movies
                                  122
Classic Movies
                                   73
                                   65
Thrillers
International TV Shows
                                   59
Crime TV Shows
                                   37
                                   30
Movies
British TV Shows
                                   21
Independent Movies
                                   20
Anime Features
                                   19
Music & Musicals
                                   18
Sci-Fi & Fantasy
                                   13
Cult Movies
                                   12
Kids' TV
                                   11
Anime Series
                                   11
Docuseries
TV Shows
                                    9
Stand-Up Comedy & Talk Shows
Romantic Movies
TV Comedies
Classic & Cult TV
TV Action & Adventure
TV Dramas
LGBTQ Movies
                                    1
Romantic TV Shows
                                    1
TV Horror
                                    1
Reality TV
Name: release_year, dtype: int64
```

```
In [53]:
```

```
netflix_copy.groupby(['Genre 2'])['release_year'].count().sort_values(ascending = False)
Out[53]:
Genre 2
 International Movies
                                  1545
 Dramas
                                   744
 Independent Movies
                                   572
 Comedies
                                   440
 Thrillers
                                   232
 Romantic Movies
                                   170
 Music & Musicals
                                   119
 Sci-Fi & Fantasy
                                   109
 Horror Movies
                                    71
 Sports Movies
                                    68
 Anime Features
                                    49
 Faith & Spirituality
 Cult Movies
 International TV Shows
                                    41
 Children & Family Movies
                                    31
                                    30
 Classic Movies
 LGBTQ Movies
                                    30
 TV Dramas
                                    23
 Romantic TV Shows
                                    22
 Documentaries
                                    21
 TV Comedies
                                    20
 Korean TV Shows
                                     9
                                     9
 Stand-Up Comedy
 Crime TV Shows
                                     8
 Docuseries
                                     7
7
3
 TV Action & Adventure
 TV Horror
Classic & Cult TV
Kids' TV
                                     2
 Reality TV
 TV Sci-Fi & Fantasy
                                     2
 Spanish-Language TV Shows
 Stand-Up Comedy & Talk Shows
 TV Mysteries
                                     1
 Science & Nature TV
Name: release_year, dtype: int64
In [54]:
```

```
netflix_copy.groupby(['Genre 3'])['release_year'].count().sort_values(ascending = False)
```

```
Genre 3
 International Movies
 Romantic Movies
 Thrillers
                                  278
 Music & Musicals
                                  191
 Independent Movies
                                  159
 Sci-Fi & Fantasy
                                  115
 Sports Movies
                                   95
 Dramas
                                   68
 LGBTQ Movies
                                   52
 TV Dramas
                                   36
 TV Comedies
                                   16
 Cult Movies
                                   14
 Comedies
                                   12
 Faith & Spirituality
                                   11
 Spanish-Language TV Shows
                                   10
 TV Mysteries
                                   10
 TV Action & Adventure
                                    7
                                    7
 International TV Shows
                                    7
 Horror Movies
 Classic Movies
                                    6
 Romantic TV Shows
 TV Horror
                                    5
 Children & Family Movies
                                    4
 Stand-Up Comedy & Talk Shows
                                    3
 TV Sci-Fi & Fantasy
                                    3
 TV Thrillers
                                    3
 Teen TV Shows
                                    3
 Kids' TV
 Korean TV Shows
Name: release_year, dtype: int64
```

4.6 Finding the best Month for releasing content?


```
In [55]:
```

netflix_copy.head(2)

Out[55]:

| | show_id | d ty | ype | title | director | cast | country | date_added | release_year | rating | duration | description | year_added | month_added | Genre 1 | |
|---|-------------|------|-----|------------------|--------------------|--|---------|------------|--------------|-----------|-------------|--|------------|-------------|----------------------|-----|
| _ | 2 s3 | | TV | Ganglands | Julien Leclercq | Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | To protect his family from a powerful drug lor | 2021 | 9 | Crime TV Shows | Int |
| | 5 s6 | | TV | Midnight Mass | Mike Flanagan | Kate Siegel, Zach Gilford, Hamish Linklater, H | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | The arrival of a charismatic young priest brin | 2021 | 9 | TV Dramas | |
| 4 | | | | | | | | | | | | | | | | - N |

In [56]:

converting month number to month name
netflix_copy['month_final'] = netflix_copy['month_added'].replace({1:'Jan', 2:'Feb', 3:'Mar', 4:'Apr', 5:'May', 6:'June', 7:'July', 8:'Aug
netflix_copy.head(2)

Out[56]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | description | year_added | month_added | Genre 1 | |
|-----|---------|------------|------------------|--------------------|--|---------|------------|--------------|-----------|-------------|--|------------|-------------|----------------------|-----|
| 2 | s3 | TV Show | Ganglands | Julien Leclercq | Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | To protect his family from a powerful drug lor | 2021 | 9 | Crime TV Shows | Int |
| 5 | s6 | TV Show | Midnight Mass | Mike Flanagan | Kate Siegel, Zach Gilford, Hamish Linklater, H | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | The arrival of a charismatic young priest brin | 2021 | 9 | TV Dramas | |
| 4.1 | | | | | | | | | | | | | | | b. |

In [57]:

netflix_copy.month_final.value_counts().to_frame('Value_count')

Out[57]:

| | Value_count |
|------|-------------|
| July | 535 |
| Dec | 511 |
| Oct | 507 |
| Jan | 503 |
| Apr | 501 |
| Mar | 497 |
| Aug | 492 |
| Sep | 475 |
| Nov | 468 |
| June | 457 |
| May | 405 |
| Feb | 349 |

```
In [58]:
```

```
sns.countplot(x=netflix_copy['month_final'],orient='v')
plt.xticks(rotation=90)
Out[58]:
(array([ 0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11]),
[Text(0, 0, 'Sep'),
  Text(1, 0, 'Aug'),
   Text(2, 0, 'July'),
   Text(3, 0, 'June'),
   Text(4, 0, 'May'),
Text(5, 0, 'Apr'),
   Text(6, 0, 'Mar'),
Text(7, 0, 'Feb'),
   Text(8, 0, 'Jan'),
Text(9, 0, 'Dec'),
   Text(10, 0, 'Nov'),
Text(11, 0, 'Oct')])
    500
    400
 900
300
    200
    100
      0
           Sep
                Aug
                     July
                           June
                                May
                                     Apr
                                          Mar
                                                Pep
                                                     Jan
                                   month final
```

Obeservation: Its clearly shows that **july** month has maximum number of movies released.july is the best Month for releasing content.

4.7 Highest watched genres on Netflix?

In [59]:

netflix_copy.head(2)

Out[59]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | description | year_added | month_added | Genre 1 | |
|---|---------|------------|------------------|--------------------|--|---------|------------|--------------|-----------|-------------|--|------------|-------------|----------------------|-----|
| 2 | s3 | TV Show | Ganglands | Julien Leclercq | Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | To protect his family from a powerful drug lor | 2021 | 9 | Crime TV Shows | Int |
| 5 | s6 | TV Show | Midnight Mass | Mike Flanagan | Kate Siegel, Zach Gilford, Hamish Linklater, H | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | The arrival of a charismatic young priest brin | 2021 | 9 | TV Dramas | |
| 4 | | | | | | | | | | | | | | | - |

In [60]:

```
netflix_copy['Genre 1'].describe(include=all)
```

Out[60]:

count 5700 unique 33 top Dramas freq 1586

Name: Genre 1, dtype: object

In [61]:

```
netflix_copy['Genre 2'].describe(include=all)
```

Out[61]:

count 4485
unique 35
top International Movies
freq 1545
Name: Genre 2, dtype: object

```
In [62]:
```

```
netflix_copy['Genre 3'].describe(include=all)

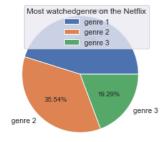
Out[62]:

count 2434
unique 29
top International Movies
freq 881
Name: Genre 3, dtype: object

In [63]:
```

```
# by using Pie chart
genre_types = ['genre 1','genre 2','genre 3']

Value_count = [5700,4485,2434]
plt.pie(Value_count, labels = genre_types, autopct="%2.2f%%")
plt.legend(title='Most watchedgenre on the Netflix')
plt.show()
```



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

4.8 Released movie over the years?

In [64]:

netflix_copy.head(2)

Out[64]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | description | year_added | month_added | Genre 1 | |
|-----|---------|------------|------------------|--------------------|--|---------|------------|--------------|-----------|-------------|--|------------|-------------|----------------------|-----|
| 2 | s3 | TV Show | Ganglands | Julien Leclercq | Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | To protect his family from a powerful drug lor | 2021 | 9 | Crime TV Shows | Int |
| 5 | s6 | TV Show | Midnight Mass | Mike Flanagan | Kate Siegel, Zach Gilford, Hamish Linklater, H | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | The arrival of a charismatic young priest brin | 2021 | 9 | TV Dramas | |
| - 4 | | | | | | | | | | | | | | | - |

In [65]:

```
# no. of movies released by every year
netflix_copy.groupby(['release_year'])['release_year'].count().sort_values(ascending = False)
```

Out[65]:

```
release_year
2018
        691
2017
        684
2016
        584
2019
        570
2020
        499
        . . .
1944
          1
1947
1946
          1
1945
          1
1942
Name: release_year, Length: 72, dtype: int64
```

In [66]:

```
netflix_copy.release_year.value_counts().to_frame('Value_count')
```

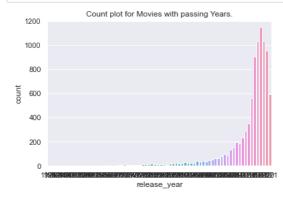
Out[66]:

| | Value_count |
|------|-------------|
| 2018 | 691 |
| 2017 | 684 |
| 2016 | 584 |
| 2019 | 570 |
| 2020 | 499 |
| | |
| 1946 | 1 |
| 1959 | 1 |
| 1942 | 1 |
| 1947 | 1 |
| 1944 | 1 |
| | |

72 rows × 1 columns

In [67]:

```
sns.countplot(x='release_year', data=netflix).set_title('Count plot for Movies with passing Years.')
sns.set(rc={'figure.figsize':(40,20)})
plt.show()
```



Observation:

From the above we can see that with passing years more movies are being made year by year

The above data shows that there is a sudden increase in the creation of movies in year 2016 as compared to year 2015

4.9 movies made on year basis? or ### In which year highest number of the TV shows & Movies were released? show with Bar Graph.

In [68]:

netflix_copy.head(2)

Out[68]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | description | year_added | month_added | Genre 1 | |
|---|---------|------------|------------------|--------------------|--|---------|------------|--------------|-----------|-------------|--|------------|-------------|----------------------|-----|
| 2 | s3 | TV Show | Ganglands | Julien Leclercq | Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | To protect his family from a powerful drug lor | 2021 | 9 | Crime TV Shows | Int |
| 5 | s6 | TV Show | Midnight Mass | Mike Flanagan | Kate Siegel, Zach Gilford, Hamish Linklater, H | missing | 2021-09-24 | 2021 | TV- MA | 1 Season | The arrival of a charismatic young priest brin | 2021 | 9 | TV Dramas | |
| 4 | | | | | | | | | | | | | | | - |

```
In [69]:
```

Out[69]:

```
netflix_copy.year_added.value_counts().to_frame('Value_count')
```

Value_count 2019 1323 2020 1248 2018 1125 2021 962 2017 744 206 2016 2015 51 14 2014 13 2011 2013 7 2012 3

In [70]:

2009 2008 2010

```
netflix_copy.dtypes
```

Out[70]:

object show_id object object type title director object cast object country object ${\tt date_added}$ datetime64[ns] release_year int64 object rating duration object description object year_added int64 month_added int64 Genre 1 object Genre 2 object Genre 3 object month_final object dtype: object

In [71]:

netflix_copy["date_added"].dt.year.value_counts()

Out[71]:

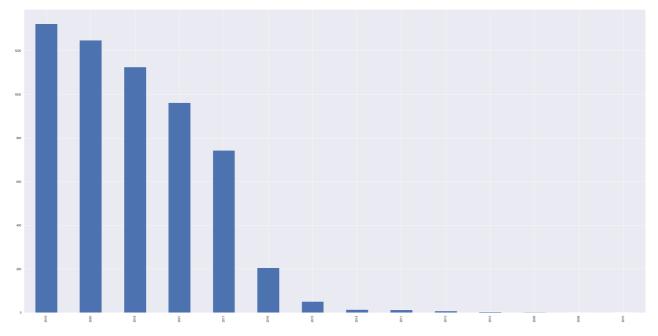
Name: date_added, dtype: int64

In [72]:

netflix_copy["date_added"].dt.year.value_counts().plot(kind='bar')

Out[72]:

<AxesSubplot:>



Obeservation: Its clearly shows that maximum movie made on yr 2019.

4.10 What is the show id and director for 'House of cards'?

In [88]:

netflix.head(2)

Out[88]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|---|---------|------------|----------------------------|--------------------|---|------------------|-----------------------|--------------|-----------|--------------|---|--|
| 0 | s1 | Movie | Dick Johnson Is Dead | Kirsten Johnson | NaN | United States | September 25, 2021 | 2020 | PG- 13 | 90 min | Documentaries | As her father nears the end of his life, filmm |
| 1 | s2 | TV Show | Blood & Water | NaN | Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban | South Africa | September 24, 2021 | 2021 | TV- MA | 2 Seasons | International TV Shows, TV Dramas, TV Mysteries | After crossing paths at a party, a Cape Town t |

In [89]:

method 1:

netflix[netflix['title'].isin(["House of Cards"])] # to shows all records of a particular item in any column

Out[89]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|------|---------|------------|-------------------|----------|--|------------------|-------------------|--------------|-----------|--------------|----------------------------|---|
| 1059 | s1060 | TV Show | House of Cards | NaN | Kevin Spacey, Robin Wright, Kate Mara, Corey S | United States | April 14, 2021 | 2018 | TV- MA | 6 Seasons | TV Dramas, TV Thrillers | A ruthless politician will stop at nothing to |

In [90]:

method 2:

netflix[netflix['title'].str.contains("House of Cards")]

Out[90]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|-----|----------------|------------|-------------------|----------|---|------------------|-------------------|--------------|-----------|--------------|----------------------------|---|
| 105 | 9 s1060 | TV Show | House of Cards | NaN | Kevin Spacey, Robin Wright, Kate Mara, | United States | April 14, 2021 | 2018 | TV- MA | 6 Seasons | TV Dramas, TV Thrillers | A ruthless politician will stop at nothing to |

Obeservation: For "House of cards" the show id is s1059 and No director.

4.11 Show all the movies that were released in year 2000.

```
In [91]:
```

netflix.head(2)

Out[91]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|---|---------|------------|----------------------------|--------------------|---|------------------|-----------------------|--------------|-----------|--------------|---|--|
| 0 | s1 | Movie | Dick Johnson Is Dead | Kirsten Johnson | NaN | United States | September 25, 2021 | 2020 | PG- 13 | 90 min | Documentaries | As her father nears the end of his life, filmm |
| 1 | s2 | TV Show | Blood & Water | NaN | Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban | South Africa | September 24, 2021 | 2021 | TV- MA | 2 Seasons | International TV Shows, TV Dramas, TV Mysteries | After crossing paths at a party, a Cape Town t |

In [92]:

| netfli | netflix[(netflix['type'] == 'Movie') & (netflix['release_year'] == 2000)] | | | | | | | | | | | | | |
|--------|--|-------|----------------------------|--------------------|---|------------------------------|----------------------|------|-----------|---------|--|---|-----|--|
| | | | ıvıarınattarı i | | Nehemi | | | | | | | punea | • | |
| 6311 | s6312 | Movie | Billy Elliot | Stephen Daldry | Jamie Bell, Gary Lewis, Stuart Wells, Billy Fa | United Kingdom, France | February 1, 2019 | 2000 | R | 110 min | Dramas, Independent Movies, International Movies | When a boy trades boxing school for ballet les | | |
| 6437 | s6438 | Movie | Center Stage | Nicholas Hytner | Amanda Schull, Zoe Saldana, Susan May Pratt, P | United States | January 1, 2020 | 2000 | PG- 13 | 116 min | Dramas | Vying for a spot in the American Ballet Compan | - 1 | |
| 6440 | s6441 | Movie | Chal Mere Bhai | David Dhawan | Sanjay Dutt, Salman Khan, Karisma Kapoor, Dali | India | December 31, 2019 | 2000 | TV-14 | 132 min | Comedies, International Movies, Romantic Movies | When a secretary saves her tycoon boss's life, | | |
| 6543 | s6544 | Movie | Crouching Tiger, Hidden | Ang Lee | Chow Yun Fat, Michelle Vech Zhang | Taiwan, Hong Kong, | March 1, | 2000 | PG- | 120 min | Action & Adventure, | A young woman in ancient China | • | |

In [93]:

netflix[(netflix['type'] == 'Movie') & (netflix['release_year'] == 2000)].shape

Out[93]:

(33, 12)

Obeservation: There are 33 movies released in year 2000.

4.12 Show only the title of all TV shows that were released in India only.

In [94]:

netflix.head(2)

Out[94]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|---|---------|------------|----------------------------|--------------------|---|------------------|-----------------------|--------------|-----------|--------------|---|--|
| 0 | s1 | Movie | Dick Johnson Is Dead | Kirsten Johnson | NaN | United States | September 25, 2021 | 2020 | PG- 13 | 90 min | Documentaries | As her father nears the end of his life, filmm |
| 1 | s2 | TV Show | Blood & Water | NaN | Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban | South Africa | September 24, 2021 | 2021 | TV- MA | 2 Seasons | International TV Shows, TV Dramas, TV Mysteries | After crossing paths at a party, a Cape Town t |

In [95]

```
netflix[(netflix['type'] == 'TV Show') & (netflix['country'] == 'India')]["title"]
```

Out[95]:

| 4 | Kota Factory |
|-------|------------------------------------|
| 39 | Chhota Bheem |
| 50 | Dharmakshetra |
| 66 | Raja Rasoi Aur Anya Kahaniyan |
| 69 | Stories by Rabindranath Tagore |
| | ••• |
| 8173 | Thackeray |
| 8235 | The Calling |
| 8321 | The Golden Years with Javed Akhtar |
| 8349 | The House That Made Me |
| 8775 | Yeh Meri Family |
| Name: | title, Length: 79, dtype: object |

```
In [96]:
```

```
netflix[(netflix['type'] == 'TV Show') & (netflix['country'] == 'India')]["title"].shape
Out[96]:
(79,)
```

Obeservation: There are 79 tv shows that were released in India only.

4.13 Show top 10 director, who gave the highest number of TV shows & Movies to Netflix?

In [97]:

netflix.head(2)

Out[97]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|---|---------|------------|----------------------------|--------------------|---|------------------|-----------------------|--------------|-----------|--------------|---|--|
| 0 | s1 | Movie | Dick Johnson Is Dead | Kirsten Johnson | NaN | United States | September 25, 2021 | 2020 | PG- 13 | 90 min | Documentaries | As her father nears the end of his life, filmm |
| 1 | s2 | TV Show | Blood & Water | NaN | Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban | South Africa | September 24, 2021 | 2021 | TV- MA | 2 Seasons | International TV Shows, TV Dramas, TV Mysteries | After crossing paths at a party, a Cape Town t |

In [98]:

netflix["director"].value_counts().head(10)

Out[98]:

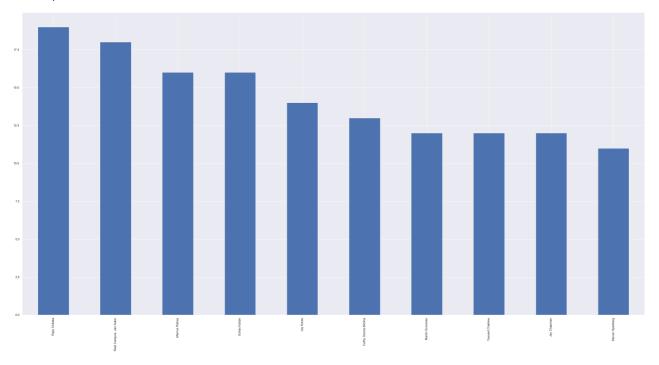
Rajiv Chilaka 19 Raúl Campos, Jan Suter 18 Marcus Raboy 16 Suhas Kadav 16 Jay Karas 14 Cathy Garcia-Molina 13 Martin Scorsese 12 Youssef Chahine 12 Jay Chapman 12 Steven Spielberg 11 Name: director, dtype: int64

In [99]:

```
# shown in bar graph
netflix["director"].value_counts().head(10).plot(kind='bar')
```

Out[99]:

<AxesSubplot:>



Observation: TOp 10 director list is shown .Rajiv Chilaka he released maximum no. of Tv shows in india

4.14 In how many movies/ tv shows, 'tom Cruise' was cast?

```
In [100]:
netflix.head(2)
```

Out[100]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|---|---------|------------|----------------------------|--------------------|---|------------------|-----------------------|--------------|-----------|--------------|---|--|
| 0 | s1 | Movie | Dick Johnson Is Dead | Kirsten Johnson | NaN | United States | September 25, 2021 | 2020 | PG- 13 | 90 min | Documentaries | As her father nears the end of his life, filmm |
| 1 | s2 | TV Show | Blood & Water | NaN | Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban | South Africa | September 24, 2021 | 2021 | TV- MA | 2 Seasons | International TV Shows, TV Dramas, TV Mysteries | After crossing paths at a party, a Cape Town t |

In [101]:

```
#method1:
netflix[netflix['cast'] == 'Tom Cruise']
```

Out[101]:

show_id type title director cast country date_added release_year rating duration listed_in description

In [102]:

```
#method2:
netflix[netflix['cast'].str.contains('Tom Cruise')]
```

```
______
ValueError
                                         Traceback (most recent call last)
Input In [102], in <cell line: 3>()
     1 #method2:
----> 3 netflix[netflix['cast'].str.contains('Tom Cruise')]
File F:\my apps\anaconda\conda\lib\site-packages\pandas\core\frame.py:3495, in DataFrame.__getitem__(self, key)
          return self.where(key)
   3494 # Do we have a (boolean) 1d indexer?
-> 3495 if com.is_bool_indexer(key):
           return self._getitem_bool_array(key)
   3498 # We are left with two options: a single key, and a collection of keys,
   3499 # We interpret tuples as collections only for non-MultiIndex
File F:\my apps\anaconda\conda\lib\site-packages\pandas\core\common.py:144, in is_bool_indexer(key)
           na msg = "Cannot mask with non-boolean array containing NA / NaN values'
   140
            if lib.infer_dtype(key) == "boolean" and isna(key).any():
    141
               # Don't raise on e.g. ["A", "B", np.nan], see
# test_loc_getitem_list_of_labels_categoricalindex_with_na
   142
   143
               raise ValueError(na_msg)
--> 144
   145
           return False
   146 return True
```

Nan values are present ,first FIII null values

· create new dataframe

In [103]:

```
netflix_copy = netflix.dropna()
netflix_copy.head(2)
```

Out[103]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|---|---------|------------|--|--------------------|---|---|-----------------------|--------------|-----------|--------------|--|---|
| 7 | s8 | Movie | Sankofa | Haile Gerima | Kofi Ghanaba, Oyafunmike Ogunlano, Alexandra D | United States, Ghana, Burkina Faso, United Kin | September 24, 2021 | 1993 | TV- MA | 125 min | Dramas, Independent Movies, International Movies | On a photo shoot in Ghana, an American model s |
| 8 | s9 | TV Show | The Great British Baking Show | Andy Devonshire | Mel Giedroyc, Sue Perkins, Mary Berry, Paul Ho | United Kingdom | September 24, 2021 | 2021 | TV-14 | 9 Seasons | British TV Shows, Reality TV | A talented batch of amateur bakers face off in |

ValueError: Cannot mask with non-boolean array containing NA / NaN values

In [104]:

netflix_copy[netflix_copy['cast'].str.contains('Tom Cruise')]

Out[104]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|------|---------|-------|-------------|----------------------------|---|------------------|-------------------|--------------|--------|----------|----------------------------------|--|
| 341 | s342 | Movie | Magnolia | Paul Thomas Anderson | John C. Reilly, Philip Baker Hall, Tom Cruise, | United States | August 1, 2021 | 1999 | R | 189 min | Dramas, Independent Movies | Through chance, history and divine interventio |
| 1254 | s1255 | Movie | Rain Man | Barry Levinson | Dustin Hoffman, Tom Cruise, Valeria Golino, Ge | United States | March 1, 2021 | 1988 | R | 134 min | Classic Movies, Dramas | Motivated by money, a selfish workaholic seeki |

Obeservation: There are two movies casted Mr.Tom Cruise -"Magnolia" & "Rain Man" .

4.15 How many movies got the "TV-14" rating in the caneda?

In [105]:

netflix.head(2)

Out[105]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|---|---------|------------|----------------------------|--------------------|---|------------------|-----------------------|--------------|-----------|--------------|---|--|
| 0 | s1 | Movie | Dick Johnson Is Dead | Kirsten Johnson | NaN | United States | September 25, 2021 | 2020 | PG- 13 | 90 min | Documentaries | As her father nears the end of his life, filmm |
| 1 | s2 | TV Show | Blood & Water | NaN | Ama Qamata, Khosi Ngema, Gail Mabalane, | South Africa | September 24, 2021 | 2021 | TV- MA | 2 Seasons | International TV Shows, TV Dramas, TV Mysteries | After crossing paths at a party, a Cape Town t |

In [106]:

netflix[(netflix['type'] == 'Movie') & (netflix['rating'] == 'TV-14')].shape

Out[106]:

(1427, 12)

```
In [107]:
```

```
netflix[(netflix['type'] == 'Movie') & (netflix['rating'] == 'TV-14') & (netflix['country'] == 'Canada')]
```

Out[107]:

| | show_id | type | title | director | cast | country | date_added | release_year | rating | duration | listed_in | description |
|------|---------|-------|--|---|--|---------|----------------------|--------------|--------|----------|---|--|
| 157 | s158 | Movie | Level 16 | Danishka Esterhazy | Katie Douglas, Celina Martin, Peter Outerbridg | Canada | September 1, 2021 | 2018 | TV-14 | 102 min | Sci-Fi & Fantasy, Thrillers | In a bleak academy that teaches girls the virt |
| 1279 | s1280 | Movie | Made You Look: A True Story About Fake Art | Barry Avrich | NaN | Canada | February 23, 2021 | 2020 | TV-14 | 90 min | Documentaries, International Movies | A woman walks into a New York gallery with a c |
| 2769 | s2770 | Movie | There's Something in the Water | Ellen Page, Ian Daniel | Ellen Page | Canada | March 27, 2020 | 2019 | TV-14 | 72 min | Documentaries, International Movies | This documentary spotlights the struggle of mi |
| 3424 | s3425 | Movie | Martin Matte: La vie, la morteh la la! | Jean- François Blais | Martin Matte | Canada | October 14, 2019 | 2019 | TV-14 | 62 min | Stand-Up Comedy | Quebecois comedy star Martin Matte serves up e |
| 5972 | s5973 | Movie | #cats_the_mewvie | Michael Margolis | NaN | Canada | February 5, 2020 | 2020 | TV-14 | 90 min | Documentaries, International Movies | This pawesome documentary explores how our fel |
| 5973 | s5974 | Movie | #Roxy | Michael Kennedy | Jake Short, Sarah Fisher, Booboo Stewart, Dann | Canada | April 10, 2019 | 2018 | TV-14 | 105 min | Comedies, Romantic Movies | A teenage hacker with a huge nose helps a cool |
| 6192 | s6193 | Movie | At First Light | Jason Stone | Stefanie Scott, Theodore Pellerin, Percy Hynes | Canada | December 27, 2018 | 2018 | TV-14 | 91 min | Dramas, Sci-Fi & Fantasy | After mysterious lights imbue her with extraor |
| 6537 | s6538 | Movie | Counterfeiting in Suburbia | Jason Bourque | Sarah Butler, Larissa Albuquerque, Kayla Walla | Canada | July 1, 2018 | 2018 | TV-14 | 88 min | Dramas, Thrillers | Two teenagers print counterfeit money in their |
| 7334 | s7335 | Movie | Long Time Running | Jennifer Baichwal, Nicholas de Pencier | Gord Downie, Paul Langlois, Gord Sinclair, Rob | Canada | November 12, 2017 | 2017 | TV-14 | 96 min | Documentaries, International Movies, Music & M | This documentary follows the 2016 tour of belo |
| 7916 | s7917 | Movie | Sadie's Last Days on Earth | Michael Seater | Morgan Taylor Campbell, Clark Backo, Ricardo H | Canada | August 22, 2017 | 2016 | TV-14 | 94 min | Comedies, Sci-Fi & Fantasy | High schooler Sadie Mitchell believes the worl |
| 7936 | s7937 | Movie | Sardaar ji | Rohit Jugraj | Diljit Dosanjh, Neeru Bajwa, Mandy Takhar, Jas | Canada | December 1, 2017 | 2015 | TV-14 | 140 min | Comedies, International Movies, Music & Musicals | When a palatial wedding venue turns out to be |
| 8178 | s8179 | Movie | The Accountant of Auschwitz | Matthew Shoychet | NaN | Canada | July 1, 2019 | 2018 | TV-14 | 78 min | Documentaries, International Movies | Decades after WWII, a former SS officer stands |
| 8566 | s8567 | Movie | The Wrong Babysitter | George Mendeluk | Daphne Zuniga, Seann Gallagher, Lisa Marie Car | Canada | June 18, 2019 | 2017 | TV-14 | 89 min | Thrillers | A widow searches for her missing teenage daugh |

In [108]:

netflix[(netflix['type'] == 'Movie') & (netflix['rating'] == 'TV-14') & (netflix['country'] == 'Canada')].shape

Out[108]:

(13, 12)

^{**} Obeservation**: There are 13 movies got the "TV-14" rating in the caneda.

Post profiling

```
In [109]:
netflix_cleaned = prf.ProfileReport(netflix_copy)
netflix_cleaned.to_file(output_file="netflix21_post_preprocessing.html")
A value is trying to be set on a copy of a slice from a DataFrame
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-vie
w-versus-a-copy (https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)
 df.rename(columns={"index": "df_index"}, inplace=True)
                                                         22/22 [00:22<00:00, 1.38it/s, Completed]
Summarize dataset: 100%
Generate report structure: 100%
                                                             1/1 [00:22<00:00, 22.27s/it]
Render HTML: 100%
                                                     1/1 [00:50<00:00, 50.09s/it]
Export report to file: 100%
                                                         1/1 [00:00<00:00, 7.75it/s]
In [110]:
netflix_cleaned.to_file(output_file="netflix21_post_preprocessing.html")
Export report to file: 100%
                                                        1/1 [00:00<00:00, 5.75it/s]
```

5. Conclusions:

We explore the Netflix dataset and saw how to clean the data and then jump into how to visualize the data with **Exploratory Data Analysis**. We saw some basic and advanced level charts of seaborn and matplotlib like Heatmap, Pie-chart, Bar chart, Countplot. And also visualize a data with **Pandas_Profiling :Preprofiling & Post_profiling**.

In []: