netflix-content-analysis

September 18, 2025

Netflix - Data Exploration and Visualisation

Problem Statement:

Netflix wants to optimize its content strategy to attract and retain subscribers across different countries. The goal is to analyze the available dataset of movies and TV shows to identify trends in content type, genres, release patterns and popular actors/directors. Insights from this analysis will help Netflix decide which type of shows or movies to produce and how to grow its business internationally.

Importing Python Libraries:

Python libraries allows us to accomplish tasks and run data analysis more efficiently by providing portions of crucial code already built for us.

[ ]:
```
import pandas as pd
!gdown https://d2beiqkhq929f0.cloudfront.net/public_assets/assets/000/000/940/
  ↪original/netflix.csv
```

```
Downloading…
From: https://d2beiqkhq929f0.cloudfront.net/public_assets/assets/000/000/940/ori
ginal/netflix.csv
To: /content/netflix.csv
100% 3.40M/3.40M [00:00<00:00, 20.8MB/s]
```

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

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

[ ]:

	release_year	duration_int	Movie_Minutes
count	8807.000000	8804.000000	6128.000000
mean	2014.180198	69.846888	99.577187
std	8.819312	50.814828	28.290593
min	1925.000000	1.000000	3.000000
25%	2013.000000	2.000000	87.000000
50%	2017.000000	88.000000	98.000000
75%	2019.000000	106.000000	114.000000
max	2021.000000	312.000000	312.000000

Data Cleaning:

[ ]:
```
df.columns
```

[ ]:
```
Index(['show_id', 'type', 'title', 'director', 'cast', 'country', 'date_added',
       'release_year', 'rating', 'duration', 'listed_in', 'description'],
      dtype='object')
```

[ ]:
```
duplicate=df.duplicated().value_counts()
print(duplicate)
```

```
False    8807
Name: count, dtype: int64
```

[ ]:
```
# NAN values replaced by 'Missing
df['director']=df['director'].fillna('unknown_director')
#Spliting the comma from the list of values
df['director'].apply(lambda x:x.split(', '))
#converting to list
a=df['director'].apply(lambda x:x.split(', ')).tolist()
a
```

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['Letizia Lamartire'],
['Ray Jiang'],
['unknown_director'],
['unknown_director'],
['Daniel Vernon'],
['Steve Gukas'],
['Tim Johnson'],
['unknown_director'],
['unknown_director'],
['unknown_director'],
['Vishwesh Krishnamoorthy'],
['unknown_director'],
['unknown_director'],
['Zack Snyder'],
['unknown_director'],
['unknown_director'],
['Uduak-Obong Patrick'],
```

```
['unknown_director'],
['Mohamed Diab'],
['Amr Salama'],
['Christopher Amos'],
['Prakash Satam'],
['unknown_director'],
['Robert Rodriguez'],
['Milan Luthria'],
['David Ayer'],
['Eshom Nelms', 'Ian Nelms'],
['James Moll'],
['unknown_director'],
['unknown_director'],
['James Redford'],
['Kaashvie Nair'],
['J.D. Dillard'],
['Nikhil Pherwani'],
['unknown_director'],
['Mae Czarina Cruz'],
['unknown_director'],
['Praveen Kandregula'],
['Cecilia Verheyden'],
['Daniel Minahan'],
['unknown_director'],
['Donovan Marsh'],
['Brent Dawes'],
['unknown_director'],
['unknown_director'],
['Leli Maki'],
['Uzodinma Okpechi'],
['Daniel Prochaska'],
['unknown_director'],
['Joe Wright'],
['unknown_director'],
['Matthew Vaughn'],
['Aditya Kripalani'],
['Adriano Rudiman'],
['David Pablos'],
['Alexandre Aja'],
['unknown_director'],
['Cai Cong'],
['Samuel Olatunji'],
['Ramon Térmens'],
['unknown_director'],
['Svetlana Cvetko'],
['unknown_director'],
['Martin Prakkat'],
```

```
['Baran bo Odar'],
['Zhang Chong'],
['Yılmaz Erdoğan'],
['Shantrelle P. Lewis'],
['unknown_director'],
['Ivan Ayr'],
['Anthony Mandler'],
['Vijay Roche'],
['unknown_director'],
["Stanley Menino D'Costa"],
['Jennifer Brea'],
['Julia von Heinz'],
['Niels Arden Oplev'],
['Don Argott', 'Sheena M. Joyce'],
['unknown_director'],
['Joshua Zeman'],
['unknown_director'],
['unknown_director'],
['Duncan Skiles'],
['unknown_director'],
['Sean McNamara'],
['unknown_director'],
['Vondie Curtis-Hall'],
['unknown_director'],
['Robert Radler'],
['Roel Reiné'],
['Todd Phillips'],
['Dean Parisot'],
['Paul Greengrass'],
['Lasse Hallström'],
['Justin Kelly'],
['Eric Darnell', 'Tom McGrath', 'Conrad Vernon'],
['unknown_director'],
['Suhas Kadav'],
['Suhas Kadav'],
['Suhas Kadav'],
['Suhas Kadav'],
['Suhas Kadav'],
['Clint Eastwood'],
['Jeff Wadlow'],
['Charles Martin'],
['Stella Corradi'],
['Roland Emmerich'],
['Kevin Macdonald'],
['Ann Deborah Fishman'],
['Chris Gorak'],
['Peter Jackson'],
```

```
['Roger Kumble'],
['Jonathan Lynn'],
['Courtney Hunt'],
['Pierre Greco', 'Nancy Florence Savard'],
['Andrew Davis'],
['Kevin Smith'],
['unknown_director'],
['Tosin Igho'],
['Chaitanya Tamhane'],
['Oriol Paulo'],
['Mike Rianda', 'Jeff Rowe'],
['Johannes Roberts'],
['unknown_director'],
['Robert Pulcini', 'Shari Springer Berman'],
['unknown_director'],
['Pedro Antonio'],
['unknown_director'],
['unknown_director'],
['John Wells'],
['Jonathan Liebesman'],
['Maria Pulera'],
['unknown_director'],
['Santhosh Viswanath'],
['Seema Pahwa'],
['unknown_director'],
['Ozan Açıktan'],
['Meltem Bozoflu'],
['Hakan Algül'],
['Selçuk Aydemir', 'Birkan Pusa'],
['Selçuk Aydemir'],
['Ömer Faruk Sorak'],
['Şenol Sönmez'],
['Alexis Morante'],
['Burak Aksak'],
['Kıvanç Baruönü'],
['Kıvanç Baruönü'],
['Rindala Kodeih'],
['Kongkiat Khomsiri'],
['Bedran Güzel'],
['Hakan Algül'],
['Marwan Nabil'],
['MIKIKO', 'Daito Manabe'],
['unknown_director'],
['Kayode Kasum'],
['Yılmaz Erdoğan', 'Ömer Faruk Sorak'],
['Takashi Shimizu'],
['unknown_director'],
```

```
 ['unknown_director'],
 ['Joe Penna'],
 …]
```

[ ]:
```
# separating the director name based on title by setting title as index
b=pd.DataFrame(a,index=df['title'])
b
```

[ ]:
```
                                    0     1     2     3     4     5     6   \
title
Dick Johnson Is Dead     Kirsten Johnson  None  None  None  None  None  None
Blood & Water           unknown_director  None  None  None  None  None  None
Ganglands                Julien Leclercq  None  None  None  None  None  None
Jailbirds New Orleans   unknown_director  None  None  None  None  None  None
Kota Factory            unknown_director  None  None  None  None  None  None
…                                      …   …   …   …   …   …   …
Zodiac                     David Fincher  None  None  None  None  None  None
Zombie Dumb             unknown_director  None  None  None  None  None  None
Zombieland               Ruben Fleischer  None  None  None  None  None  None
Zoom                        Peter Hewitt  None  None  None  None  None  None
Zubaan                       Mozez Singh  None  None  None  None  None  None

                          7     8     9     10    11    12
title
Dick Johnson Is Dead    None  None  None  None  None  None
Blood & Water           None  None  None  None  None  None
Ganglands               None  None  None  None  None  None
Jailbirds New Orleans   None  None  None  None  None  None
Kota Factory            None  None  None  None  None  None
…                        …   …   …   …   …   …
Zodiac                  None  None  None  None  None  None
Zombie Dumb             None  None  None  None  None  None
Zombieland              None  None  None  None  None  None
Zoom                    None  None  None  None  None  None
Zubaan                  None  None  None  None  None  None

[8807 rows x 13 columns]
```

[ ]:
```
#Using stack merging the columns to rows and shows 0,1 as per number of␣
 ↪directors
pd.DataFrame(a,index=df['title']).stack()
```

[ ]:
```
title
Dick Johnson Is Dead   0     Kirsten Johnson
Blood & Water          0    unknown_director
Ganglands              0     Julien Leclercq
Jailbirds New Orleans  0    unknown_director
```

```
Kota Factory           0    unknown_director
                                   …
Zodiac                 0       David Fincher
Zombie Dumb            0    unknown_director
Zombieland             0     Ruben Fleischer
Zoom                   0        Peter Hewitt
Zubaan                 0         Mozez Singh
Length: 9612, dtype: object
```

[ ]:
```
#On Stacking pandas create the index name for the unnamed one by using stack
pd.DataFrame(a,index=df['title']).stack().reset_index()
```

[ ]:
```
                      title  level_1                 0
0      Dick Johnson Is Dead        0   Kirsten Johnson
1             Blood & Water        0  unknown_director
2                 Ganglands        0   Julien Leclercq
3     Jailbirds New Orleans        0  unknown_director
4              Kota Factory        0  unknown_director
…                        …      …                 …
9607                Zodiac        0     David Fincher
9608           Zombie Dumb        0  unknown_director
9609            Zombieland        0   Ruben Fleischer
9610                  Zoom        0      Peter Hewitt
9611                Zubaan        0       Mozez Singh

[9612 rows x 3 columns]
```

[ ]:
```
director=pd.DataFrame(a,index=df['title']).stack().reset_index().drop(columns =␣
↪'level_1').rename(columns = {0:'director'})
director
```

[ ]:
```
                      title          director
0      Dick Johnson Is Dead   Kirsten Johnson
1             Blood & Water  unknown_director
2                 Ganglands   Julien Leclercq
3     Jailbirds New Orleans  unknown_director
4              Kota Factory  unknown_director
…                        …                 …
9607                Zodiac     David Fincher
9608           Zombie Dumb  unknown_director
9609            Zombieland   Ruben Fleischer
9610                  Zoom      Peter Hewitt
9611                Zubaan       Mozez Singh

[9612 rows x 2 columns]
```

[ ]:
```
type_shows=df[['title','type']]
type_shows
```

[ ]:
```
                     title     type
0      Dick Johnson Is Dead    Movie
1             Blood & Water  TV Show
2                 Ganglands  TV Show
3     Jailbirds New Orleans  TV Show
4              Kota Factory  TV Show
…                       …       …
8802                Zodiac    Movie
8803            Zombie Dumb  TV Show
8804             Zombieland    Movie
8805                   Zoom    Movie
8806                 Zubaan    Movie

[8807 rows x 2 columns]
```

[ ]:
```
date_columns=df[['title','date_added','release_year']]
date_columns
```

[ ]:
```
                     title          date_added  release_year
0      Dick Johnson Is Dead  September 25, 2021          2020
1             Blood & Water  September 24, 2021          2021
2                 Ganglands  September 24, 2021          2021
3     Jailbirds New Orleans  September 24, 2021          2021
4              Kota Factory  September 24, 2021          2021
…                       …                 …           …
8802                Zodiac   November 20, 2019          2007
8803            Zombie Dumb        July 1, 2019          2018
8804             Zombieland    November 1, 2019          2009
8805                   Zoom    January 11, 2020          2006
8806                 Zubaan       March 2, 2019          2015

[8807 rows x 3 columns]
```

[ ]:
```
df['cast']=df['cast'].fillna('unknown_actor')
df['cast'].apply(lambda x:x.split(', '))
a1=df['cast'].apply(lambda x:x.split(', ')).tolist()
cast=pd.DataFrame(a1,index=df['title'])
pd.DataFrame(a1,index=df['title']).stack()
pd.DataFrame(a1,index=df['title']).stack().reset_index()
cast=pd.DataFrame(a1,index=df['title']).stack().reset_index().drop(columns =␣
 ↪'level_1').rename(columns = {0:'cast'})
cast
```

[ ]:
```
                      title                   cast
0      Dick Johnson Is Dead           unknown_actor
1             Blood & Water              Ama Qamata
2             Blood & Water            Khosi Ngema
3             Blood & Water           Gail Mabalane
4             Blood & Water          Thabang Molaba
…                       …                       …
64946               Zubaan        Manish Chaudhary
64947               Zubaan            Meghna Malik
64948               Zubaan           Malkeet Rauni
64949               Zubaan          Anita Shabdish
64950               Zubaan   Chittaranjan Tripathy

[64951 rows x 2 columns]
```

[ ]:
```
df['country']=df['country'].fillna('Missing_countryname')
df['country'].apply(lambda x:x.split(', '))
a2=df['country'].apply(lambda x:x.split(', ')).tolist()
country=pd.DataFrame(a2,index=df['title'])
pd.DataFrame(a2,index=df['title']).stack()
pd.DataFrame(a2,index=df['title']).stack().reset_index()
country=pd.DataFrame(a2,index=df['title']).stack().reset_index().drop(columns =␣
↪'level_1').rename(columns = {0:'country'})
country
```

[ ]:
```
                       title              country
0       Dick Johnson Is Dead        United States
1              Blood & Water         South Africa
2                  Ganglands  Missing_countryname
3      Jailbirds New Orleans  Missing_countryname
4               Kota Factory                India
…                        …                    …
10840                Zodiac        United States
10841           Zombie Dumb  Missing_countryname
10842            Zombieland        United States
10843                  Zoom        United States
10844                Zubaan                India

[10845 rows x 2 columns]
```

[ ]:
```
df['listed_in']=df['listed_in'].fillna('unknown_genre')
df['listed_in'].apply(lambda x:x.split(', '))
a3=df['listed_in'].apply(lambda x:x.split(', ')).tolist()
listed_in=pd.DataFrame(a3,index=df['title'])
pd.DataFrame(a3,index=df['title']).stack()
pd.DataFrame(a3,index=df['title']).stack().reset_index()
```

```
listed_in=pd.DataFrame(a3,index=df['title']).stack().reset_index().drop(columns␣
 ↪= 'level_1').rename(columns = {0:'listed_in'})
listed_in
```

[ ]:

	title	listed_in
0	Dick Johnson Is Dead	Documentaries
1	Blood & Water	International TV Shows
2	Blood & Water	TV Dramas
3	Blood & Water	TV Mysteries
4	Ganglands	Crime TV Shows
…	…	…
19318	Zoom	Children & Family Movies
19319	Zoom	Comedies
19320	Zubaan	Dramas
19321	Zubaan	International Movies
19322	Zubaan	Music & Musicals

[19323 rows x 2 columns]

[ ]:
```
def safe_int(x):
    try:
        return int(x.split(' ')[0])  # converting to an integer
    except (ValueError, AttributeError):
        return None  # Return None if conversion fails

df['duration'] = df['duration'].astype(str)
df['duration_int'] = df['duration'].apply(safe_int)  # Extract integer part of␣
 ↪duration
df['duration_type'] = df['duration'].str.extract(r'(\D+)')  # Extract the␣
 ↪Duration Type (min or Season)
df['Movie_Minutes'] = df[df.type=='Movie']['duration'].apply(safe_int)

# Select desired columns for the new DataFrame
new_df = df[['title', 'duration_int', 'duration_type','Movie_Minutes']]

# Display the new DataFrame
new_df
```

[ ]:

	title	duration_int	duration_type	Movie_Minutes
0	Dick Johnson Is Dead	90.0	min	90.0
1	Blood & Water	2.0	Seasons	NaN
2	Ganglands	1.0	Season	NaN
3	Jailbirds New Orleans	1.0	Season	NaN
4	Kota Factory	2.0	Seasons	NaN
…	…	…	…	…
8802	Zodiac	158.0	min	158.0
8803	Zombie Dumb	2.0	Seasons	NaN

```
8804              Zombieland          88.0           min           88.0
8805                    Zoom          88.0           min           88.0
8806                  Zubaan         111.0           min          111.0

[8807 rows x 4 columns]
```

Data cleaning is crucial before analysis because it ensures the accuracy, consistency, and reliability of the data leading to more meaningful and trustworthy results. By removing errors, inconsistencies, and missing values data cleaning minimizes the risk of inaccurate analysis and helps in making informed decisions.

Merging the columns:

[ ]:
```
# Defining type_shows
type_shows = df[['title', 'type']]

# Merging dataframes
merge1 = director.merge(cast, on='title')
merge2 = merge1.merge(country, on='title')
merge3 = merge2.merge(listed_in, on='title')
merge4 = merge3.merge(type_shows, on='title') # type_shows used here
merge5 = merge4.merge(date_columns, on='title')
cleaned_data = merge5.merge(df[['title', 'Movie_Minutes']], on='title')
cleaned_data
```

[ ]:
```
                      title         director                  cast  \
0       Dick Johnson Is Dead   Kirsten Johnson          unknown_actor
1              Blood & Water  unknown_director             Ama Qamata
2              Blood & Water  unknown_director             Ama Qamata
3              Blood & Water  unknown_director             Ama Qamata
4              Blood & Water  unknown_director            Khosi Ngema
…                        …               …                      …
201986                Zubaan       Mozez Singh         Anita Shabdish
201987                Zubaan       Mozez Singh         Anita Shabdish
201988                Zubaan       Mozez Singh  Chittaranjan Tripathy
201989                Zubaan       Mozez Singh  Chittaranjan Tripathy
201990                Zubaan       Mozez Singh  Chittaranjan Tripathy

              country              listed_in     type          date_added  \
0       United States          Documentaries    Movie  September 25, 2021
1        South Africa  International TV Shows  TV Show  September 24, 2021
2        South Africa              TV Dramas  TV Show  September 24, 2021
3        South Africa           TV Mysteries  TV Show  September 24, 2021
4        South Africa  International TV Shows  TV Show  September 24, 2021
…                 …                      …      …                     …
201986          India   International Movies    Movie       March 2, 2019
201987          India       Music & Musicals    Movie       March 2, 2019
201988          India                 Dramas    Movie       March 2, 2019
```

```
201989          India    International Movies    Movie       March 2, 2019
201990          India        Music & Musicals    Movie       March 2, 2019

        release_year  Movie_Minutes
0               2020           90.0
1               2021            NaN
2               2021            NaN
3               2021            NaN
4               2021            NaN
…                …              …
201986          2015          111.0
201987          2015          111.0
201988          2015          111.0
201989          2015          111.0
201990          2015          111.0

[201991 rows x 9 columns]
```

Merging is done to add variables to a dataset, append or add cases or observations to a dataset or remove duplicates and other incorrect information

Dropping Duplicates:

[ ]:
```
cleaned_data.duplicated()
```

[ ]:
```
0         False
1         False
2         False
3         False
4         False
          …
201986    False
201987    False
201988    False
201989    False
201990    False
Length: 201991, dtype: bool
```

[ ]:
```
cleaned_data.loc[cleaned_data.duplicated()]
```

[ ]:
```
                     title        director                 cast  \
39336            Rust Creek     Jen McGowan       Micah Hauptman
88516       Blood Will Tell    Miguel Cohan       Oscar Martínez
88517       Blood Will Tell    Miguel Cohan       Oscar Martínez
88518       Blood Will Tell    Miguel Cohan       Oscar Martínez
88519       Blood Will Tell    Miguel Cohan       Oscar Martínez
88520       Blood Will Tell    Miguel Cohan       Oscar Martínez
88521       Blood Will Tell    Miguel Cohan       Oscar Martínez
```

88522	Blood Will Tell	Miguel Cohan	Dolores Fonzi
88523	Blood Will Tell	Miguel Cohan	Dolores Fonzi
88524	Blood Will Tell	Miguel Cohan	Dolores Fonzi
88525	Blood Will Tell	Miguel Cohan	Dolores Fonzi
88526	Blood Will Tell	Miguel Cohan	Dolores Fonzi
88527	Blood Will Tell	Miguel Cohan	Dolores Fonzi
88528	Blood Will Tell	Miguel Cohan	Diego Velázquez
88529	Blood Will Tell	Miguel Cohan	Diego Velázquez
88530	Blood Will Tell	Miguel Cohan	Diego Velázquez
88531	Blood Will Tell	Miguel Cohan	Diego Velázquez
88532	Blood Will Tell	Miguel Cohan	Diego Velázquez
88533	Blood Will Tell	Miguel Cohan	Diego Velázquez
88534	Blood Will Tell	Miguel Cohan	Paulina Garcia
88535	Blood Will Tell	Miguel Cohan	Paulina Garcia
88536	Blood Will Tell	Miguel Cohan	Paulina Garcia
88537	Blood Will Tell	Miguel Cohan	Paulina Garcia
88538	Blood Will Tell	Miguel Cohan	Paulina Garcia
88539	Blood Will Tell	Miguel Cohan	Paulina Garcia
88540	Blood Will Tell	Miguel Cohan	Luis Gnecco
88541	Blood Will Tell	Miguel Cohan	Luis Gnecco
88542	Blood Will Tell	Miguel Cohan	Luis Gnecco
88543	Blood Will Tell	Miguel Cohan	Luis Gnecco
88544	Blood Will Tell	Miguel Cohan	Luis Gnecco
88545	Blood Will Tell	Miguel Cohan	Luis Gnecco
88546	Blood Will Tell	Miguel Cohan	Malena Sánchez
88547	Blood Will Tell	Miguel Cohan	Malena Sánchez
88548	Blood Will Tell	Miguel Cohan	Malena Sánchez
88549	Blood Will Tell	Miguel Cohan	Malena Sánchez
88550	Blood Will Tell	Miguel Cohan	Malena Sánchez
88551	Blood Will Tell	Miguel Cohan	Malena Sánchez
88552	Blood Will Tell	Miguel Cohan	Emilio Vodanovich
88553	Blood Will Tell	Miguel Cohan	Emilio Vodanovich
88554	Blood Will Tell	Miguel Cohan	Emilio Vodanovich
88555	Blood Will Tell	Miguel Cohan	Emilio Vodanovich
88556	Blood Will Tell	Miguel Cohan	Emilio Vodanovich
88557	Blood Will Tell	Miguel Cohan	Emilio Vodanovich
88558	Blood Will Tell	Miguel Cohan	Norman Briski
88559	Blood Will Tell	Miguel Cohan	Norman Briski
88560	Blood Will Tell	Miguel Cohan	Norman Briski
88561	Blood Will Tell	Miguel Cohan	Norman Briski
88562	Blood Will Tell	Miguel Cohan	Norman Briski
88563	Blood Will Tell	Miguel Cohan	Norman Briski
135609	300 Miles to Heaven	Maciej Dejczer	Adrianna Biedrzyńska
135610	300 Miles to Heaven	Maciej Dejczer	Adrianna Biedrzyńska
135611	300 Miles to Heaven	Maciej Dejczer	Adrianna Biedrzyńska
135612	300 Miles to Heaven	Maciej Dejczer	Adrianna Biedrzyńska
135613	300 Miles to Heaven	Maciej Dejczer	Adrianna Biedrzyńska

```
135614  300 Miles to Heaven  Maciej Dejczer  Adrianna Biedrzyńska

             country             listed_in   type         date_added  \
39336   United States             Thrillers  Movie  November 30, 2020
88516       Argentina                Dramas  Movie      June 21, 2019
88517       Argentina    Independent Movies  Movie      June 21, 2019
88518       Argentina  International Movies  Movie      June 21, 2019
88519   United States                Dramas  Movie      June 21, 2019
88520   United States    Independent Movies  Movie      June 21, 2019
88521   United States  International Movies  Movie      June 21, 2019
88522       Argentina                Dramas  Movie      June 21, 2019
88523       Argentina    Independent Movies  Movie      June 21, 2019
88524       Argentina  International Movies  Movie      June 21, 2019
88525   United States                Dramas  Movie      June 21, 2019
88526   United States    Independent Movies  Movie      June 21, 2019
88527   United States  International Movies  Movie      June 21, 2019
88528       Argentina                Dramas  Movie      June 21, 2019
88529       Argentina    Independent Movies  Movie      June 21, 2019
88530       Argentina  International Movies  Movie      June 21, 2019
88531   United States                Dramas  Movie      June 21, 2019
88532   United States    Independent Movies  Movie      June 21, 2019
88533   United States  International Movies  Movie      June 21, 2019
88534       Argentina                Dramas  Movie      June 21, 2019
88535       Argentina    Independent Movies  Movie      June 21, 2019
88536       Argentina  International Movies  Movie      June 21, 2019
88537   United States                Dramas  Movie      June 21, 2019
88538   United States    Independent Movies  Movie      June 21, 2019
88539   United States  International Movies  Movie      June 21, 2019
88540       Argentina                Dramas  Movie      June 21, 2019
88541       Argentina    Independent Movies  Movie      June 21, 2019
88542       Argentina  International Movies  Movie      June 21, 2019
88543   United States                Dramas  Movie      June 21, 2019
88544   United States    Independent Movies  Movie      June 21, 2019
88545   United States  International Movies  Movie      June 21, 2019
88546       Argentina                Dramas  Movie      June 21, 2019
88547       Argentina    Independent Movies  Movie      June 21, 2019
88548       Argentina  International Movies  Movie      June 21, 2019
88549   United States                Dramas  Movie      June 21, 2019
88550   United States    Independent Movies  Movie      June 21, 2019
88551   United States  International Movies  Movie      June 21, 2019
88552       Argentina                Dramas  Movie      June 21, 2019
88553       Argentina    Independent Movies  Movie      June 21, 2019
88554       Argentina  International Movies  Movie      June 21, 2019
88555   United States                Dramas  Movie      June 21, 2019
88556   United States    Independent Movies  Movie      June 21, 2019
88557   United States  International Movies  Movie      June 21, 2019
88558       Argentina                Dramas  Movie      June 21, 2019
```

88559	Argentina	Independent Movies	Movie	June 21, 2019	
88560	Argentina	International Movies	Movie	June 21, 2019	
88561	United States	Dramas	Movie	June 21, 2019	
88562	United States	Independent Movies	Movie	June 21, 2019	
88563	United States	International Movies	Movie	June 21, 2019	
135609	Denmark	Dramas	Movie	October 1, 2019	
135610	Denmark	International Movies	Movie	October 1, 2019	
135611	France	Dramas	Movie	October 1, 2019	
135612	France	International Movies	Movie	October 1, 2019	
135613	Poland	Dramas	Movie	October 1, 2019	
135614	Poland	International Movies	Movie	October 1, 2019	

	release_year	Movie_Minutes
39336	2018	108.0
88516	2019	113.0
88517	2019	113.0
88518	2019	113.0
88519	2019	113.0
88520	2019	113.0
88521	2019	113.0
88522	2019	113.0
88523	2019	113.0
88524	2019	113.0
88525	2019	113.0
88526	2019	113.0
88527	2019	113.0
88528	2019	113.0
88529	2019	113.0
88530	2019	113.0
88531	2019	113.0
88532	2019	113.0
88533	2019	113.0
88534	2019	113.0
88535	2019	113.0
88536	2019	113.0
88537	2019	113.0
88538	2019	113.0
88539	2019	113.0
88540	2019	113.0
88541	2019	113.0
88542	2019	113.0
88543	2019	113.0
88544	2019	113.0
88545	2019	113.0
88546	2019	113.0
88547	2019	113.0
88548	2019	113.0

```
88549           2019          113.0
88550           2019          113.0
88551           2019          113.0
88552           2019          113.0
88553           2019          113.0
88554           2019          113.0
88555           2019          113.0
88556           2019          113.0
88557           2019          113.0
88558           2019          113.0
88559           2019          113.0
88560           2019          113.0
88561           2019          113.0
88562           2019          113.0
88563           2019          113.0
135609          1989           93.0
135610          1989           93.0
135611          1989           93.0
135612          1989           93.0
135613          1989           93.0
135614          1989           93.0
```

[ ]:
```
cleaned_data.drop_duplicates(inplace=True)
```

[ ]:
```
cleaned_data
```

[ ]:
```
                      title          director                  cast  \
0       Dick Johnson Is Dead   Kirsten Johnson          unknown_actor
1              Blood & Water  unknown_director             Ama Qamata
2              Blood & Water  unknown_director             Ama Qamata
3              Blood & Water  unknown_director             Ama Qamata
4              Blood & Water  unknown_director           Khosi Ngema
…                        …               …                     …
201986                Zubaan       Mozez Singh         Anita Shabdish
201987                Zubaan       Mozez Singh         Anita Shabdish
201988                Zubaan       Mozez Singh  Chittaranjan Tripathy
201989                Zubaan       Mozez Singh  Chittaranjan Tripathy
201990                Zubaan       Mozez Singh  Chittaranjan Tripathy

              country               listed_in     type          date_added  \
0       United States           Documentaries    Movie  September 25, 2021
1        South Africa  International TV Shows  TV Show  September 24, 2021
2        South Africa               TV Dramas  TV Show  September 24, 2021
3        South Africa             TV Mysteries  TV Show  September 24, 2021
4        South Africa  International TV Shows  TV Show  September 24, 2021
…                 …                       …      …                     …
201986          India    International Movies    Movie       March 2, 2019
```

```
201987          India        Music & Musicals    Movie       March 2, 2019
201988          India                  Dramas    Movie       March 2, 2019
201989          India    International Movies    Movie       March 2, 2019
201990          India        Music & Musicals    Movie       March 2, 2019

        release_year  Movie_Minutes
0               2020           90.0
1               2021            NaN
2               2021            NaN
3               2021            NaN
4               2021            NaN
…                …              …
201986          2015          111.0
201987          2015          111.0
201988          2015          111.0
201989          2015          111.0
201990          2015          111.0

[201936 rows x 9 columns]
```

[ ]:
```
cleaned_data['title'].nunique()
```

[ ]:
```
8807
```

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

```
<class 'pandas.core.frame.DataFrame'>
Index: 201936 entries, 0 to 201990
Data columns (total 9 columns):
 #   Column         Non-Null Count   Dtype
---  ------         --------------   -----
 0   title          201936 non-null  object
 1   director       201936 non-null  object
 2   cast           201936 non-null  object
 3   country        201936 non-null  object
 4   listed_in      201936 non-null  object
 5   type           201936 non-null  object
 6   date_added     201778 non-null  object
 7   release_year   201936 non-null  int64
 8   Movie_Minutes  145785 non-null  float64
dtypes: float64(1), int64(1), object(7)
memory usage: 15.4+ MB
```

Removed the duplicates and made changes permanently in the cleaned_data.

Analysis and Recommendations:

Non-Graphical Analysis:

[ ]:
```
director_counts = cleaned_data['director'].value_counts()
print(director_counts)
cast_counts = cleaned_data['cast'].value_counts()
print(cast_counts)

country_counts = cleaned_data['country'].value_counts()
print(country_counts)

listed_in_counts = cleaned_data['listed_in'].value_counts()
print(listed_in_counts)

type_counts = cleaned_data['type'].value_counts()
print(type_counts)
```

```
director
unknown_director       50643
Martin Scorsese          419
Youssef Chahine          409
Cathy Garcia-Molina      356
Steven Spielberg         355
                         …
Harvey Lilley              1
Jason Orley                1
Jeannie Gaffigan           1
Mario Rouleau              1
Richard Mears              1
Name: count, Length: 4994, dtype: int64
cast
unknown_actor      2146
Liam Neeson         161
Alfred Molina       160
John Krasinski      139
Salma Hayek         130
                    …
Damien Echols         1
Anne Lamott           1
Duncan Trussell       1
Leather Storrs        1
Christian James       1
Name: count, Length: 36440, dtype: int64
country
United States          59324
India                  22814
United Kingdom         12945
Missing_countryname    11897
Japan                   8679
                        …
```

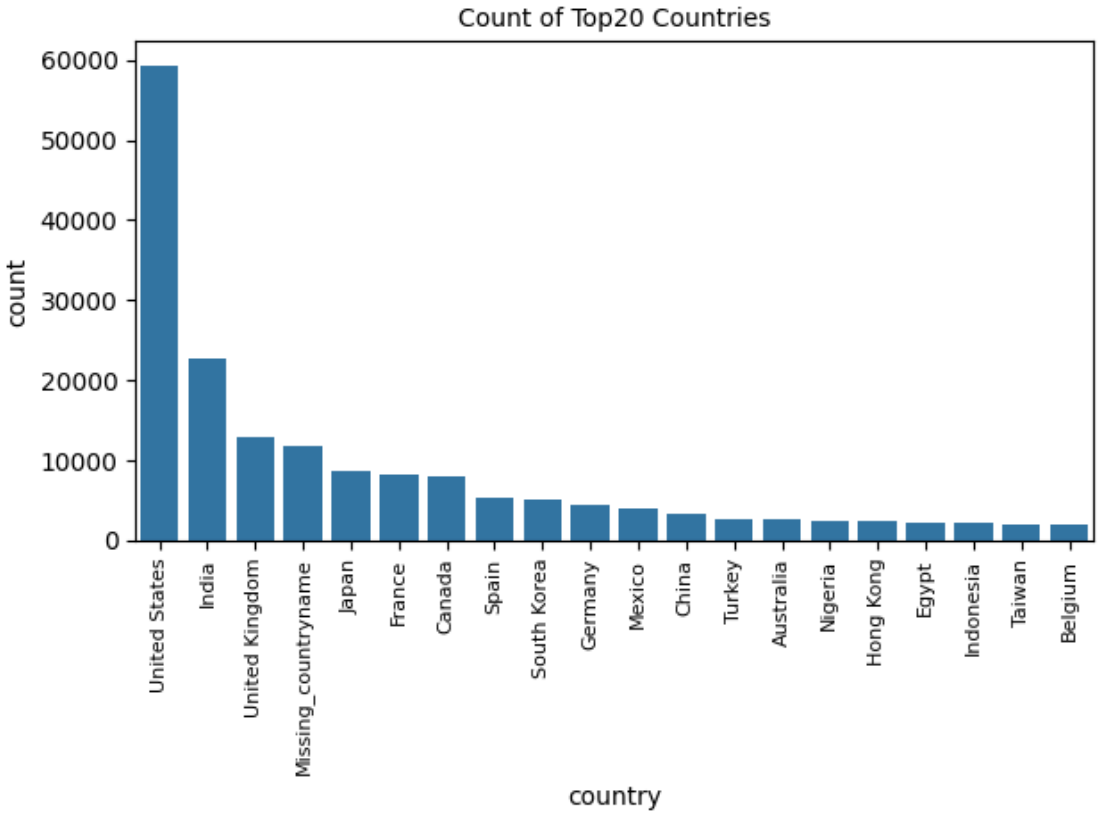
```
Botswana                    2
United States,              1
Nicaragua                   1
Kazakhstan                  1
Uganda                      1
Name: count, Length: 128, dtype: int64
listed_in
Dramas                          29756
International Movies            28192
Comedies                        20829
International TV Shows          12845
Action & Adventure              12216
Independent Movies               9818
Children & Family Movies         9771
TV Dramas                        8942
Thrillers                        7106
Romantic Movies                  6412
TV Comedies                      4963
Crime TV Shows                   4733
Horror Movies                    4571
Kids' TV                         4568
Sci-Fi & Fantasy                 4037
Music & Musicals                 3077
Romantic TV Shows                3049
Documentaries                    2407
Anime Series                     2313
TV Action & Adventure            2288
Spanish-Language TV Shows        2126
British TV Shows                 1808
Sports Movies                    1531
Classic Movies                   1434
TV Mysteries                     1281
Korean TV Shows                  1122
Cult Movies                      1077
Anime Features                   1045
TV Sci-Fi & Fantasy              1045
TV Horror                         941
Docuseries                        845
LGBTQ Movies                      838
TV Thrillers                      768
Teen TV Shows                     742
Reality TV                        735
Faith & Spirituality              719
Stand-Up Comedy                   540
Movies                            412
TV Shows                          337
Classic & Cult TV                 272
Stand-Up Comedy & Talk Shows      268
```

```
Science & Nature TV               157
Name: count, dtype: int64
type
Movie      145788
TV Show     56148
Name: count, dtype: int64
```

Graphical analysis (Univariate Analysis with bar plot):

[ ]:
```
%matplotlib inline
import matplotlib.pyplot as plt
import seaborn as sns

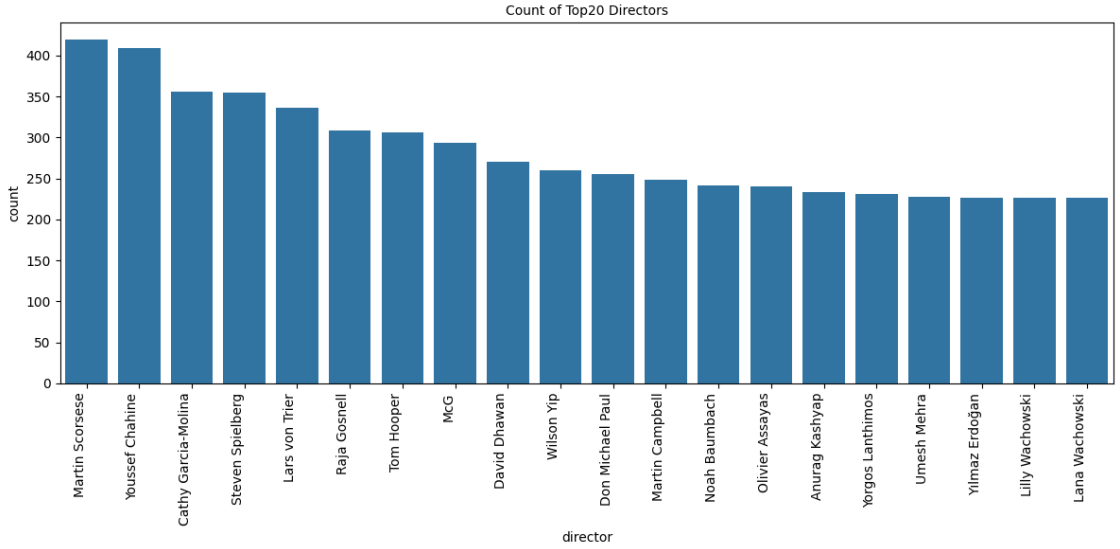
top_countries = cleaned_data['country'].value_counts().nlargest(20).index
sns.countplot(x='country',data=cleaned_data,order=top_countries)
plt.xticks(rotation=90, fontsize=8)
plt.title('Count of Top20 Countries',fontsize=10)
plt.tight_layout()
plt.show()
```



[ ]:
```
%matplotlib inline
import matplotlib.pyplot as plt
import seaborn as sns

# Filter out 'unknown_director' rows before calculating top directors
filtered_data = cleaned_data[cleaned_data['director'] != 'unknown_director']

top_directors = filtered_data['director'].value_counts().nlargest(20).index
plt.figure(figsize=(12, 6))
sns.countplot(x='director', data=cleaned_data, order=top_directors)
plt.xticks(rotation=90, ha='right')
plt.title('Count of Top20 Directors',fontsize=10)
plt.tight_layout()
plt.show()
```

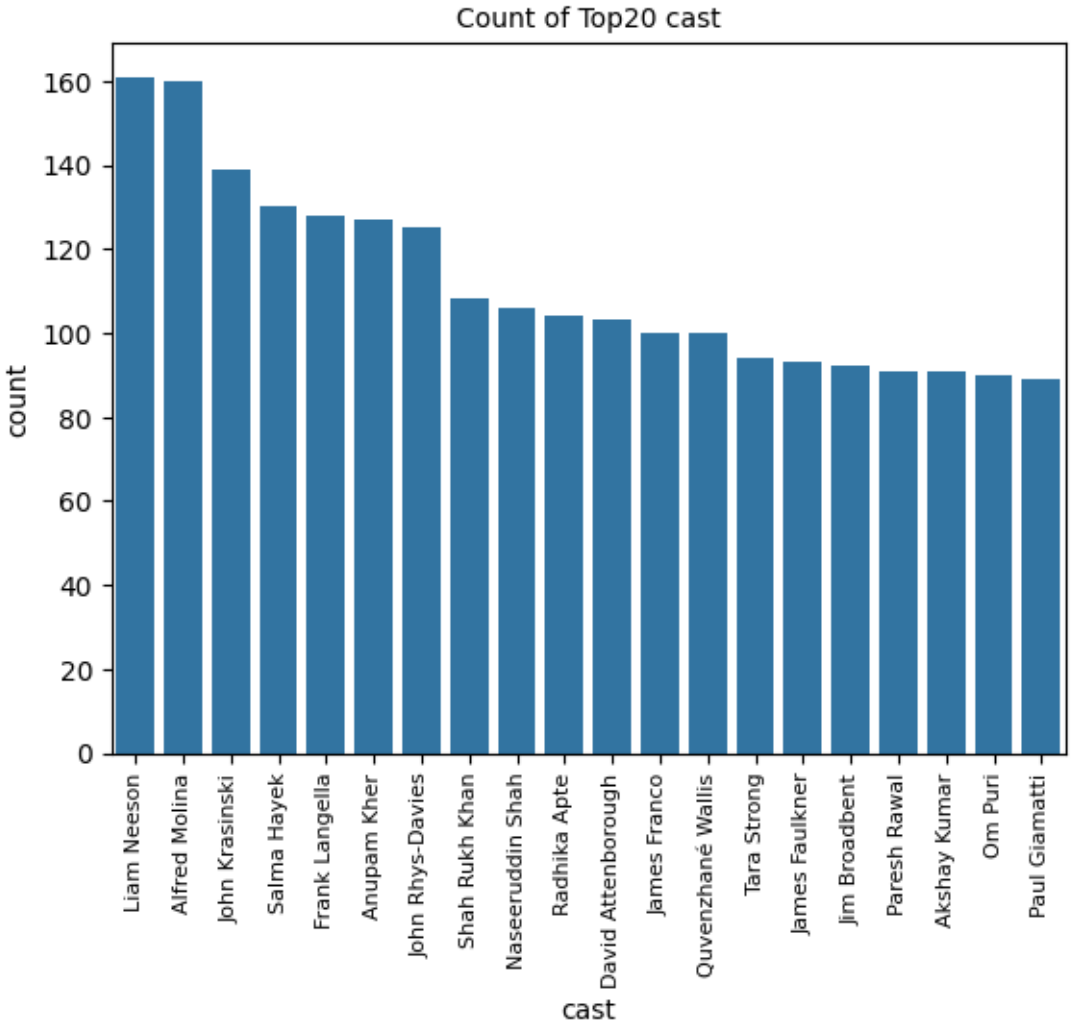


[ ]:
```
%matplotlib inline
import matplotlib.pyplot as plt
import seaborn as sns
import re

# #cast contains $ and we were getting value error while plotting
# cleaned_data['cast'] = cleaned_data['cast'].str.replace('$', '', regex=True)

cleaned_data['cast'] = cleaned_data['cast'].str.replace('Joey Bada$$','Joey␣
 ↪Badass')
cleaned_data['cast'] = cleaned_data['cast'].str.replace('Too $hort','Too Short')
filtered_cast = cleaned_data[cleaned_data['cast'] != 'unknown_actor']
top_casts = filtered_cast['cast'].value_counts().nlargest(20).index
```

```
sns.countplot(x='cast',data=cleaned_data,order=top_casts, width = 0.8)
plt.title('Count of Top20 cast',fontsize=10)
plt.xticks(rotation=90, fontsize=8)
plt.show()
```

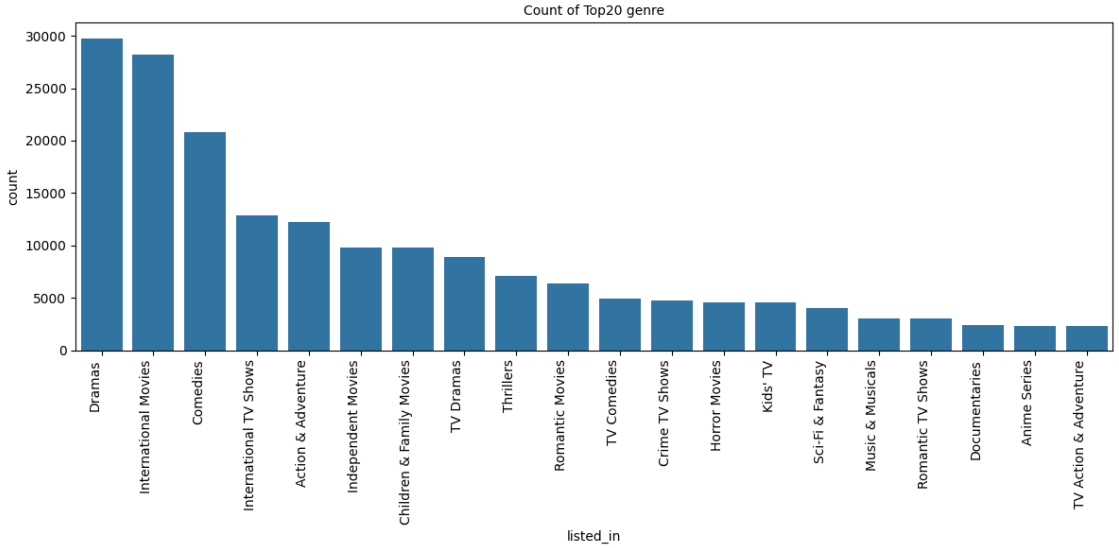


[ ]:
```
%matplotlib inline
import matplotlib.pyplot as plt
import seaborn as sns

# Filter out 'unknown_director' rows before calculating top directors
filtered_data = cleaned_data[cleaned_data['listed_in'] != 'unknown_genre']

top_genres = filtered_data['listed_in'].value_counts().nlargest(20).index
plt.figure(figsize=(12, 6))
sns.countplot(x='listed_in', data=cleaned_data, order=top_genres)
```

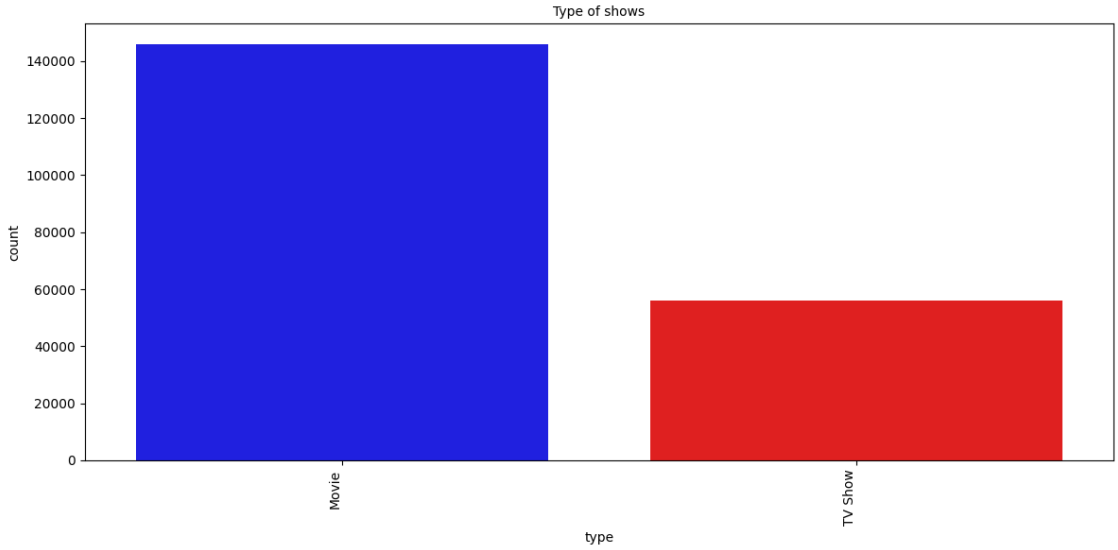
```
plt.xticks(rotation=90, ha='right')
plt.title('Count of Top20 genre',fontsize=10)
plt.tight_layout()
plt.show()
```



[ ]:
```
%matplotlib inline
import matplotlib.pyplot as plt
import seaborn as sns

filtered_data = cleaned_data[cleaned_data['type'] != 'unknown_type']
top_type = filtered_data['type'].value_counts().nlargest(20).index

plt.figure(figsize=(12, 6))
sns.countplot(x='type', data=cleaned_data, order=top_type, hue='type',␣
 ↪palette={'Movie': 'blue', 'TV Show': 'red'})
plt.xticks(rotation=90, ha='right')
plt.title('Type of shows', fontsize=10)
plt.tight_layout()
plt.show()
```



Analysis from the counts of each categorical variable in both graphical and non-graphical format:

Below are the count of each category of the cleaned dataset,

United States have the more counts of TV shows and Movies

Martin Scorsese and **Youssef Chahine** are the top most directors with

more counts

Liam Neeson and **Affred Molina** are top actors with more count of movies and tv shows

Dramas and **International movies** are the most listed genres

Count of movies is greater than count of tv shows.

It is recommended that based on these counts Netflix can get an idea of how to improve the same logic in other countries too.

Comparison Analysis:

[ ]:
```
groupby_movies=cleaned_data[cleaned_data['type']=='Movie'].
  ↪groupby('country')['title'].count()
groupby_movies.sort_values(ascending=False).head(10)
```

[ ]:
```
country
United States          45791
India                  21411
United Kingdom          8560
France                  6605
Missing_countryname     6199
Canada                  5738
```

```
Japan                    3525
Spain                    3469
Germany                  3427
China                    2377
Name: title, dtype: int64
```

[ ]:
```
groupby_tvShows=cleaned_data[cleaned_data['type']=='TV Show'].
  ↪groupby('country')['title'].count()
groupby_tvShows.sort_values(ascending=False).head(10)
```

[ ]:
```
country
United States          13533
Missing_countryname     5698
Japan                   5154
United Kingdom          4385
South Korea             3754
Canada                  2177
Mexico                  2018
Spain                   1846
Taiwan                  1719
France                  1647
Name: title, dtype: int64
```

Analysis of comparison between tv shows and movies among each country:

US ranks1st in TV shows and Movies production in Netflix.

Hence Netflix can focus more on countries that have large production numbers like **US,India, United Kingdom, Japan, Canada, South Korea** to release tv shows or movies.

Analysis between Cast and shows:

[ ]:
```
filtered_cast_data = cleaned_data[cleaned_data['cast'] != 'unknown_actor']
groupby_cast_tvShow=filtered_cast_data[filtered_cast_data['type']=='TV Show'].
  ↪groupby('cast')['title'].count()
groupby_cast_tvShow = groupby_cast_tvShow.sort_values(ascending=False).head(10)
print(groupby_cast_tvShow)
```

```
cast
David Attenborough    82
Takahiro Sakurai      56
Yuki Kaji             45
Ai Kayano             41
Junichi Suwabe        39
Daisuke Ono           38
Yuichi Nakamura       38
Jun Fukuyama          38
Kate Harbour          37
Amandla Stenberg      35
```

```
Name: title, dtype: int64
```

[ ]:
```
filtered_cast_data = cleaned_data[cleaned_data['cast'] != 'unknown_actor']
groupby_cast_movie=filtered_cast_data[filtered_cast_data['type']=='Movie'].
  ↪groupby('cast')['title'].count()
groupby_cast_movie = groupby_cast_movie.sort_values(ascending=False).head(10)
print(groupby_cast_movie)
```

```
cast
Liam Neeson           161
Alfred Molina         157
John Krasinski        138
Salma Hayek           130
Frank Langella        128
Anupam Kher           118
John Rhys-Davies      116
Shah Rukh Khan        108
Naseeruddin Shah      106
Quvenzhané Wallis     100
Name: title, dtype: int64
```

Analysis on Cast with shows:

David Attenborough acted in most number of TVshows.

Liam Neeson acted in most number of Movies.

Netflix should focus more on releasing tvshows/Movies casted by the above actors to attract more subscribers

Analysis based on Directors:

[ ]:
```
filtered_director_data = cleaned_data[cleaned_data['director'] !=␣
  ↪'unknown_director']
groupby_director_tvshow=filtered_director_data[filtered_director_data['type']=='TV␣
  ↪Show'].groupby('director')['title'].count()
groupby_director_tvshow.sort_values(ascending=False).head(10)
```

[ ]:
```
director
Noam Murro            189
Thomas Astruc         160
Damien Chazelle       104
Alan Poul             104
Houda Benyamina       104
Laïla Marrakchi       104
Rob Seidenglanz       103
Alejandro Lozano       90
Jay Oliva              81
Manolo Caro            78
Name: title, dtype: int64
```

```
[ ]: filtered_director_data = cleaned_data[cleaned_data['director'] !=␣
      ↪'unknown_director']
     groupby_director_movie=filtered_director_data[filtered_director_data['type']=='Movie'].
      ↪groupby('director')['title'].count()
     groupby_director_movie.sort_values(ascending=False).head(10)
```

```
[ ]: director
     Martin Scorsese        419
     Youssef Chahine        409
     Cathy Garcia-Molina    356
     Steven Spielberg       355
     Lars von Trier         336
     Raja Gosnell           308
     Tom Hooper             306
     McG                    293
     David Dhawan           270
     Wilson Yip             260
     Name: title, dtype: int64
```

Analysis on Directors with shows:

Noam Murro have directed more TV shows.

Martin Scorsese have directed more Movies

Netflix should focus more on releasing tvshows/Movies directed by the above actors to attract more subscribers to Neflix

Analysis on listed_in (genre):

```
[ ]: India_data = cleaned_data[cleaned_data['country'] == 'India']

     # Group by listed_in and count
     most_watched = India_data['listed_in'].value_counts().
      ↪sort_values(ascending=False)

     # Printing the results
     print(most_watched)
```

```
listed_in
International Movies            7059
Dramas                          5569
Comedies                        2685
Independent Movies              1394
Action & Adventure              1187
Romantic Movies                  931
Music & Musicals                 847
Thrillers                        743
International TV Shows           428
```

```
Horror Movies                    307
TV Dramas                        272
Children & Family Movies         225
TV Shows                         207
TV Comedies                      141
Sports Movies                    121
Sci-Fi & Fantasy                 111
Classic Movies                    98
Romantic TV Shows                 68
Crime TV Shows                    61
Kids' TV                          57
TV Action & Adventure             44
Cult Movies                       42
LGBTQ Movies                      33
Documentaries                     32
TV Horror                         28
TV Sci-Fi & Fantasy               27
Faith & Spirituality              20
British TV Shows                  19
Docuseries                        15
TV Mysteries                      11
Stand-Up Comedy & Talk Shows       8
Reality TV                         7
Stand-Up Comedy                    7
Teen TV Shows                      7
TV Thrillers                       3
Name: count, dtype: int64
```

Analysis on most watched genre in India:

International movies,Dramas,Comedies are the most watched genres in India. Hence Netflix can focus more on adding such genres in India.

Analysis on Duration based on minutes:

[ ]:
```
type_shows = df[['title', 'type', 'Movie_Minutes']]

horror_movies = cleaned_data[cleaned_data['listed_in'].str.contains('Horror')]

# Calculating the average duration
average_duration = horror_movies['Movie_Minutes'].mean()

# Printing the result
print(f"The average duration of horror movies is:{average_duration} minutes")
```

```
The average duration of horror movies is:99.01903303434698 minutes
```

Analysis of Avg duration of horror movies:

My friend wants to know the average duration of horror movies. So I made an analysis above and

the average duration of horror movies is **99 minutes**.

Analysis on Duration based on seasons:

[ ]:
```
tv_shows = cleaned_data[cleaned_data['type'] == 'TV Show']
tv_show_counts = tv_shows.groupby('title')['title'].count().
 ↪reset_index(name='watch_count')

# Merging with original dataframe to get duration (number of seasons)
tv_show_counts = pd.merge(tv_show_counts, df[['title', 'duration']],␣
 ↪on='title', how='left')

# Converting duration to numeric (number of seasons) and handling non-numeric␣
 ↪values
tv_show_counts['duration'] = tv_show_counts['duration'].str.extract('(\d+)').
 ↪astype(float)

# Sorting by duration (number of seasons) and then watch count
tv_show_counts = tv_show_counts.sort_values(['duration', 'watch_count'],␣
 ↪ascending=[False, False])


# To get the top show based on the highest number of seasons
top_show_by_seasons = tv_show_counts.iloc[0]

# Printing the result
print(f"The TV show with the most seasons is: {top_show_by_seasons['title']}")
print(f"Number of seasons: {top_show_by_seasons['duration']}")
print(f"Watch count: {top_show_by_seasons['watch_count']}")
```

```
The TV show with the most seasons is: Grey's Anatomy
Number of seasons: 17.0
Watch count: 30
```

Analysis on TV shows with most seasons:

Grey's Anatomy is the tv show with most seasons with 17 seasons which can be preferred for binge watching

Graphical Analysis of growing trend:

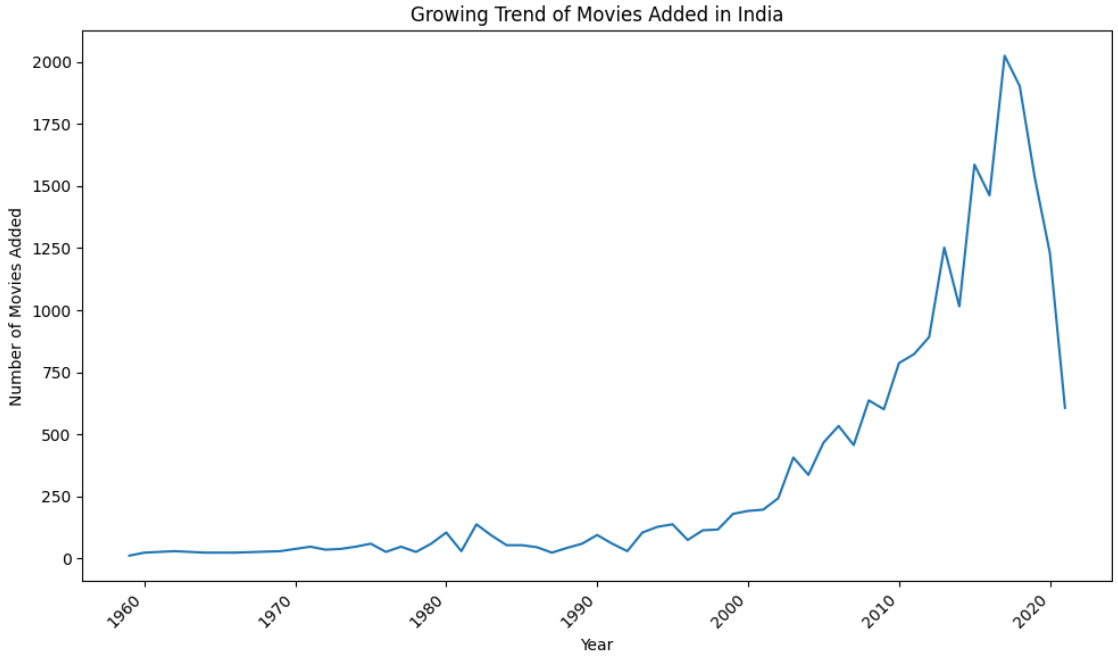
[ ]:
```
import matplotlib.pyplot as plt
import seaborn as sns

# Filtering data for movies in India
india_movies = cleaned_data[(cleaned_data['country'] == 'India') &␣
 ↪(cleaned_data['type'] == 'Movie')]

# Group by year added and count occurrences
```

```
movie_counts_by_year = india_movies.groupby('release_year')['title'].count().
  ↪reset_index(name='count')

# Creating a line plot
plt.figure(figsize=(10, 6))
sns.lineplot(x='release_year', y='count', data=movie_counts_by_year)
plt.title('Growing Trend of Movies Added in India')
plt.xlabel('Year')
plt.ylabel('Number of Movies Added')
plt.xticks(rotation=45, ha='right')
plt.tight_layout()
plt.show()
```



Analysis on Growing Trend of Movies Added in India:

Since the year 2000, the growing trend of movies has been increased in India with upto 2000 movies

If Netflix focus on doing the same by adding more movies in other countries also same like India, subscribers will increase and Netflix can also see more profit on their side.

Graphical & Non-Graphical Analysis on recently added genre based on date_added:

[ ]:
```
# Converting 'date_added' to datetime objects
cleaned_data['date_added'] = pd.to_datetime(cleaned_data['date_added'],␣
  ↪errors='coerce')

# Extracting the year
```

```
cleaned_data['year_added'] = cleaned_data['date_added'].dt.year

# To Find the most recent year
most_recent_year = cleaned_data['year_added'].max()

# Printing the result
print(f"The most recent year added is: {most_recent_year}")
```

```
The most recent year added is: 2021.0
```

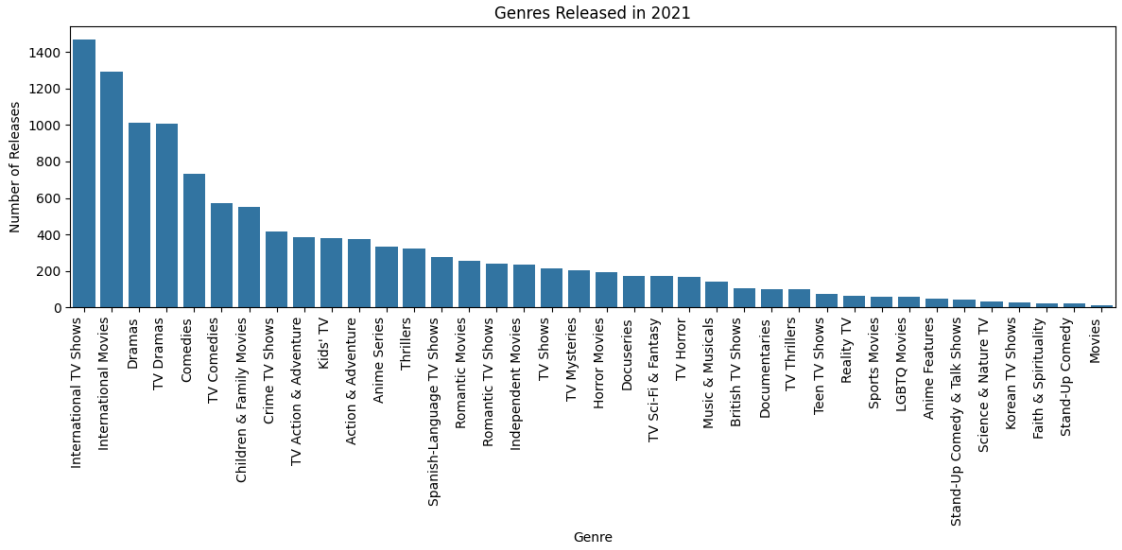
[ ]:
```
import matplotlib.pyplot as plt
import seaborn as sns

# Filtering data for content released in 2021
released_2021 = cleaned_data[cleaned_data['release_year'] == 2021]

# Group by genre and count occurrences
genre_counts = released_2021.groupby('listed_in')['title'].count().
 ↪reset_index(name='count')

# Sort by count in descending order
genre_counts = genre_counts.sort_values('count', ascending=False)

# Create a bar plot
plt.figure(figsize=(12, 6))
sns.barplot(x='listed_in', y='count', data=genre_counts)
plt.title('Genres Released in 2021')
plt.xlabel('Genre')
plt.ylabel('Number of Releases')
plt.xticks(rotation=90, ha='right')
plt.tight_layout()
plt.show()
```



Analysis of Recently added Genre:

2021 is the recent year where genres are added.

In analysis, **International TV Shows** tops the list of recently added genre.

This analysis will help people who are looking out for recently added tv shows/movies in 2021

Graphical Analysis made on basis of Proportion:

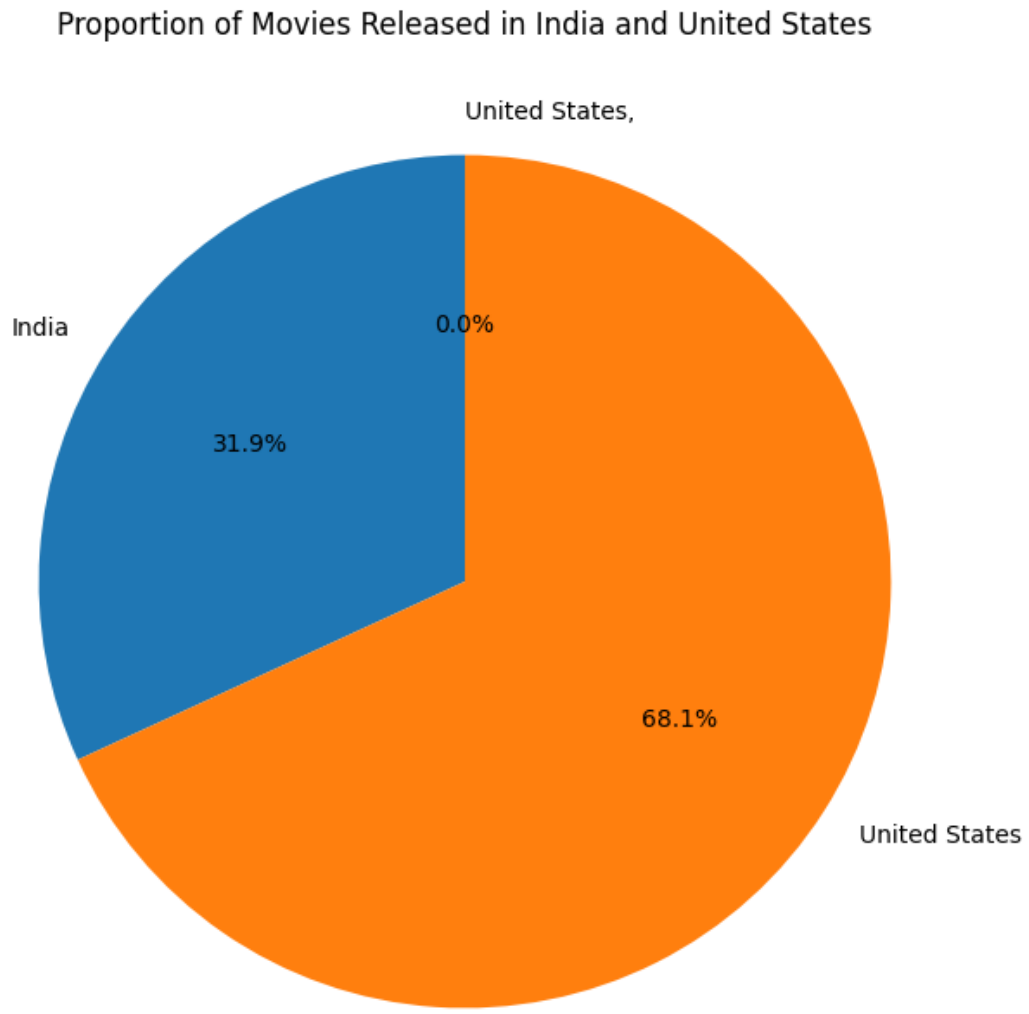
[ ]:
```
import matplotlib.pyplot as plt

# Filtering data for movies
movies_data = cleaned_data[cleaned_data['type'] == 'Movie']

# Filtering for India and United States
india_us_movies = movies_data[movies_data['country'].apply(lambda x: 'India' in␣
 ↪x or 'United States' in x)]

# Group by country and count occurrences
country_counts = india_us_movies.groupby('country')['title'].count()

# Creating a pie chart
plt.figure(figsize=(8, 8))  # Adjust figure size as needed
plt.pie(country_counts, labels=country_counts.index, autopct='%1.1f%%',␣
 ↪startangle=90)
plt.title('Proportion of Movies Released in India and United States')
plt.show()
```



Analysis of proportion between US movie count and India movie count:

Even though India ranked 2nd in the count of movies released still it has much difference with the United States which ranked top.

Netflix can focus in increasing more movies in India.

Analysis based on Cast:

[ ]:
```
indian_movies = cleaned_data[(cleaned_data['country'] == 'India') &␣
 ↪(cleaned_data['type'] == 'Movie')]
filtered_cast_data = indian_movies[indian_movies['cast'] != 'unknown_actor']
actor_counts = filtered_cast_data.groupby('cast')['title'].count().
 ↪reset_index(name='movie_count')
```

```
print (actor_counts)
```

```
                      cast  movie_count
0                A.K. Hangal           12
1                A.R. Rahman            3
2            A.S. Sasi Kumar            3
3               Aabhas Yadav            3
4              Aachal Munjal            2
…                        …          …
3677            Zohra Sehgal            3
3678            Zoya Hussain            3
3679             Zul Vellani            3
3680  Ólafur Darri Ólafsson            2
3681             Şafak Sezer            3

[3682 rows x 2 columns]
```

Analysis of actor with most released movies in India:

A.K. Hangal has the highest released movie count in India with 12 movie counts.

Indians are therefore having various recommendations for A.K.Hangal movies

Analysis based on year added of movies:

[ ]:
```
movies_data = cleaned_data[cleaned_data['type'] == 'Movie']
import pandas as pd

cleaned_data['date_added'] = pd.to_datetime(cleaned_data['date_added'],␣
 ↪errors='coerce')
cleaned_data['year_added'] = cleaned_data['date_added'].dt.year
max_year = cleaned_data[cleaned_data['type'] == 'Movie'].
 ↪groupby('year_added')['title'].count().reset_index(name='movie_count').
 ↪loc[lambda df: df['movie_count'].idxmax()]

print(f"The year with the most movies added to Netflix is:␣
 ↪{max_year['year_added']}")
print(f"Number of movies added: {max_year['movie_count']}")
```

```
The year with the most movies added to Netflix is: 2019.0
Number of movies added: 34392.0
```

Analysis on year with most movies added in Netflix:

Most movies were added in Netflix in the year **2019** with the count of **34,446 movies**.

Here subscribers have plenty of options to explore movies released in 2019.

Analysis based on cast and listed_in(genre):

[ ]:
```
exploded_genres = cleaned_data.explode('listed_in')

filtered_cast_data = exploded_genres[exploded_genres['cast'] != 'unknown_actor']

actor_genres = filtered_cast_data.groupby('cast')['listed_in'].nunique().
 ↪reset_index(name='genre_count')

multi_genre_actors = actor_genres[actor_genres['genre_count'] > 1]

multi_genre_actors = multi_genre_actors.sort_values('genre_count',␣
 ↪ascending=False)
print("Actors who have acted in multiple genres:")
print(multi_genre_actors)
```

```
Actors who have acted in multiple genres:
                     cast  genre_count
28716          Ron Perlman           17
18153       Kiernan Shipka           16
11174            Gary Cole           16
11641          Glenn Close           15
29600    Samuel L. Jackson           14
…                      …          …
25892         Pascal Atuma            2
25882       Parvati Sehgal            2
25876     Parthveer Shukla            2
25906        Pasi Ruohonen            2
25905  Pasha D. Lychnikoff            2

[32665 rows x 2 columns]
```

Analysis on actors who acted in multiple genre:

Ron Perlman has acted in multiple genre with count of 17 followed by Kiernan Shipka, Gary Cole, Glenn close, Samuel L.Jackson

Analysis based on month:

[ ]:
```
import pandas as pd
import calendar

cleaned_data['date_added'] = pd.to_datetime(cleaned_data['date_added'],␣
 ↪errors='coerce')
cleaned_data['release_month'] = cleaned_data['date_added'].dt.month

tv_shows = cleaned_data[cleaned_data['type'] == 'TV Show']
monthly_releases = tv_shows.groupby('release_month')['title'].count()

most_released_month_number = monthly_releases.idxmax()
```

```
most_released_month_name = calendar.month_name[int(most_released_month_number)]␣
  ↪ # Convert to int

print(f"The most released month for TV shows is: {most_released_month_name}")
```

```
The most released month for TV shows is: December
```

Analysis of most released month of a tv show:

This analysis shows that the maximum number of tv shows are released in the month of December.

Hence it recommends viewers to look into particular month if they need various options.

[ ]:
```
import pandas as pd
import calendar

cleaned_data['date_added'] = pd.to_datetime(cleaned_data['date_added'],␣
  ↪errors='coerce')
cleaned_data['release_month'] = cleaned_data['date_added'].dt.month

movies = cleaned_data[cleaned_data['type'] == 'Movie']
monthly_releases = movies.groupby('release_month')['title'].count()

most_released_month_number = monthly_releases.idxmax()
most_released_month_name = calendar.month_name[int(most_released_month_number)]␣
  ↪ # Convert to int

print(f"The most released month for movies is: {most_released_month_name}")
```

```
The most released month for movies is: July
```

Analysis of most released month of a movie:

This analysis shows that the maximum number of movies are released in the month of July.

Hence it recommends viewers to look into particular month if they need various options in movies.

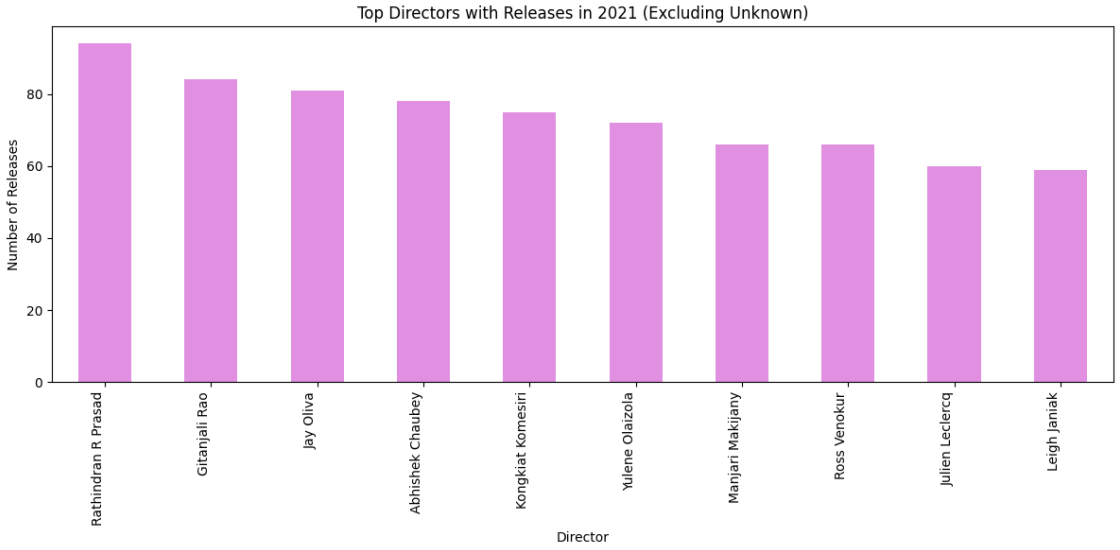
Graphical (Bivariate Cat-Num) Analysis based on Directors and release_year:

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

most_recent_year = cleaned_data['release_year'].max()
recent_releases = cleaned_data[(cleaned_data['release_year'] ==␣
  ↪most_recent_year) & (cleaned_data['director'] != 'unknown_director')]

director_counts = recent_releases.groupby('director')['title'].count().
  ↪reset_index(name='count')
top_directors = director_counts.sort_values('count', ascending=False).head(10)
```

```
plt.figure(figsize=(12,6))
sns.barplot(x='director', y='count', data=top_directors, color='violet', width␣
 ↪= 0.5)
plt.xticks(rotation=90, ha='right')
plt.title(f'Top Directors with Releases in {most_recent_year} (Excluding␣
 ↪Unknown)')
plt.xlabel('Director')
plt.ylabel('Number of Releases')
plt.tight_layout()
plt.show()
```



Analysis of Directors with recent released year:

It is found in analysis that Director Rathindran R Prasad has more movies released in 2021 which is the recent year.

Other directors are also there with only minimum difference.

This analysis will help the audience and Netflix to focus more on those directors

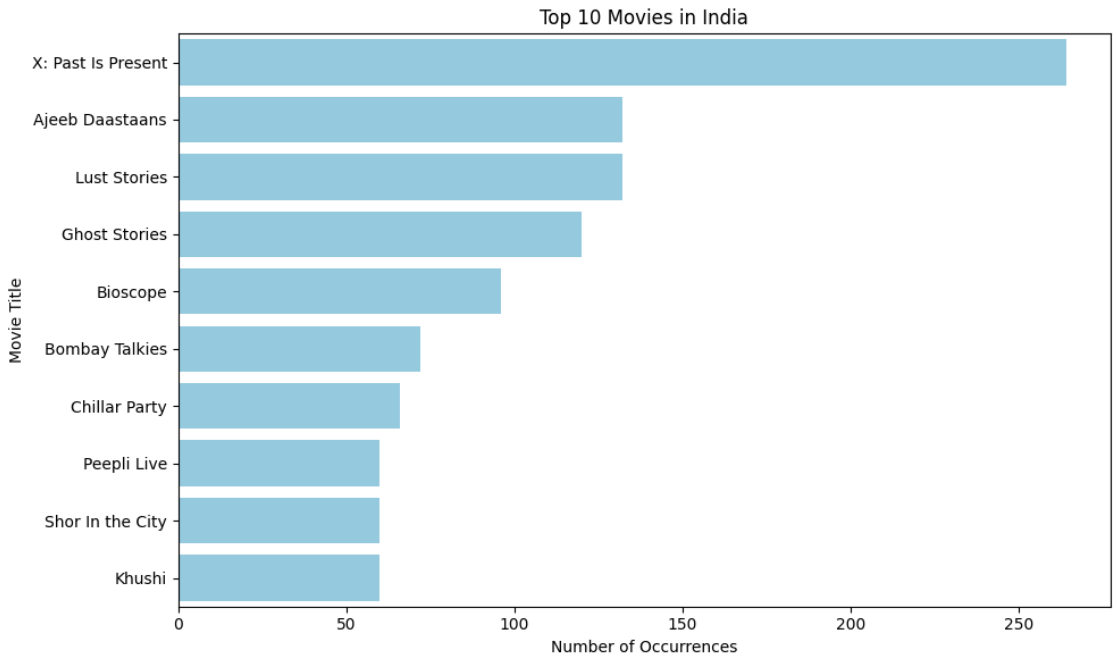
Analysis based on Movies in India:

[ ]:
```
import matplotlib.pyplot as plt
import seaborn as sns


india_movies = cleaned_data[(cleaned_data['country'] == 'India') &␣
 ↪(cleaned_data['type'] == 'Movie')]

top_10_movies = india_movies['title'].value_counts().head(10)
```

```
plt.figure(figsize=(10, 6))
sns.barplot(y=top_10_movies.index, x=top_10_movies.values, orient='h',␣
↪color='skyblue')
plt.title('Top 10 Movies in India')
plt.xlabel('Number of Occurrences')
plt.ylabel('Movie Title')
plt.tight_layout()
plt.show()
```



Analysis of top 10 movies in India:

Me and my friend wants to know which movie is in top with most number of occurences.

This analysis will give me the top 10 movies.

The movie **X: Past is Present** is the movie with most number of occurences followed by Ajeeb Daastaans, Lust stories, Ghost stories etc

This analysis will be helpful when people wants to watch movie with most number of occurences.

Corelation Analysis using heat map:

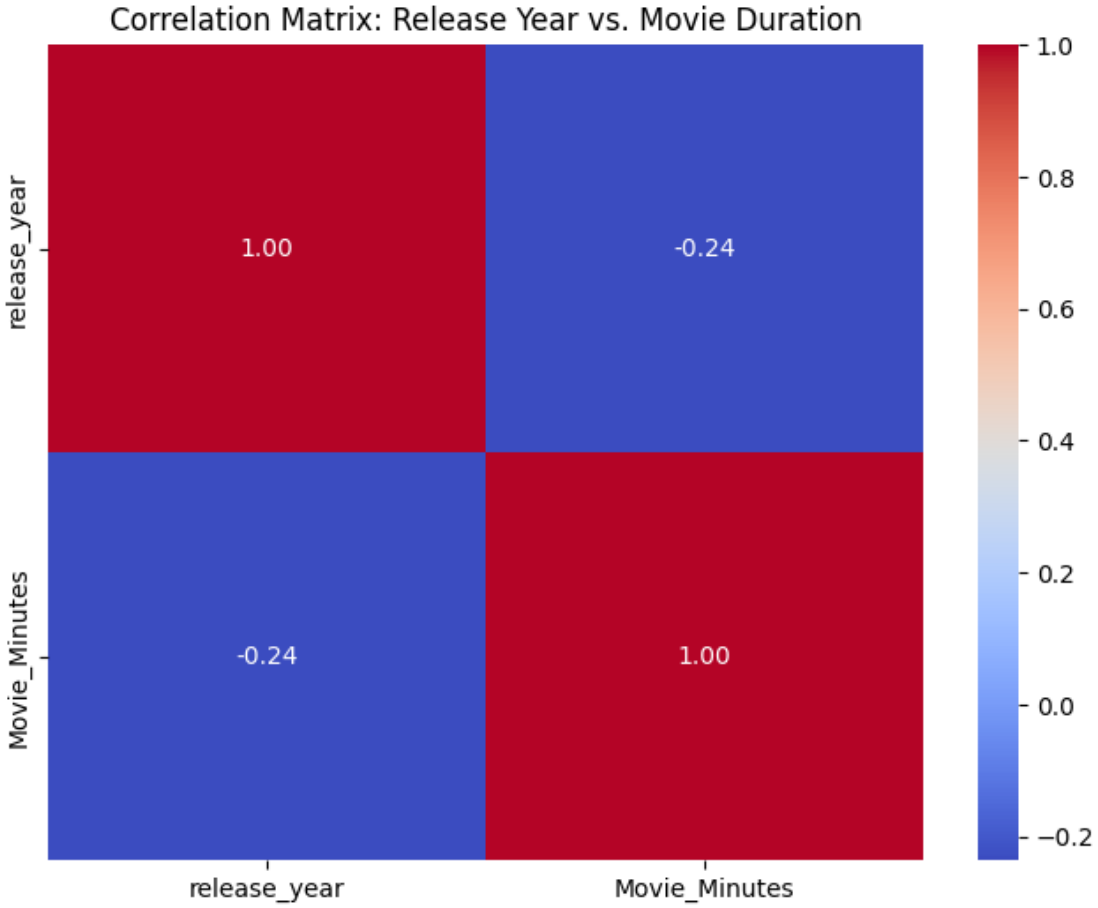
[ ]:
```
import pandas as pd
import seaborn as sns
import matplotlib.pyplot as plt


movies_data = cleaned_data[cleaned_data['type'] == 'Movie']
```

```
correlation_data = movies_data[['release_year', 'Movie_Minutes']]

correlation_matrix = correlation_data.corr()

plt.figure(figsize=(8, 6))
sns.heatmap(correlation_matrix, annot=True, cmap='coolwarm', fmt=".2f")
plt.title('Correlation Matrix: Release Year vs. Movie Duration')
plt.show()
```



Analysis between movie release year and duration:

The heatmap generated by the code provides a visual representation of the correlation between movie release year and duration.

By analyzing the color intensity and the annotation value, we can gain insights into the strength and direction of this relationship, helping us understand potential trends in movie durations over time.

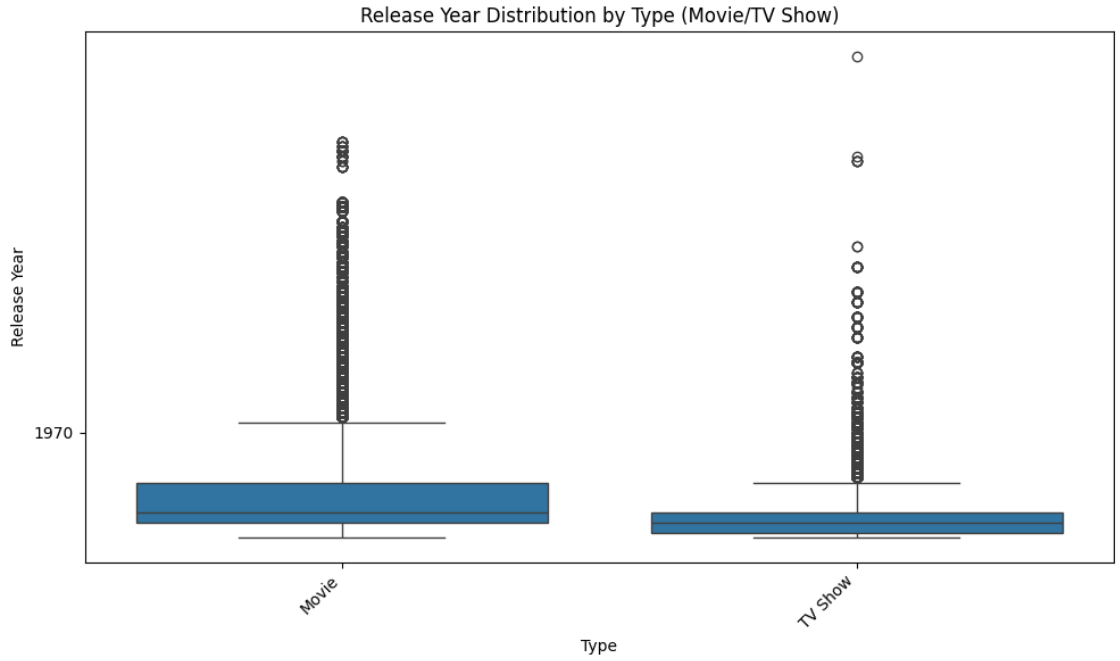
However, it's crucial to remember that correlation does not equal causation, and the interpretation

should be made cautiously considering the context of the data and research question.

Analysis of Categorical variables using Box plot:

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

plt.figure(figsize=(10, 6))
sns.boxplot(x='type', y='release_year', data=cleaned_data)
plt.title('Release Year Distribution by Type (Movie/TV Show)')
plt.xlabel('Type')
plt.ylabel('Release Year')
plt.xticks(rotation=45, ha='right')
plt.gca().invert_yaxis()
plt.tight_layout()
plt.show()
```



Analysis of relationship between type (Movie or TV Show) and release_year using a box plot:

Movies on Netflix have a wider range of release years, including older titles.

TV shows tend to have more recent releases compared to movies.

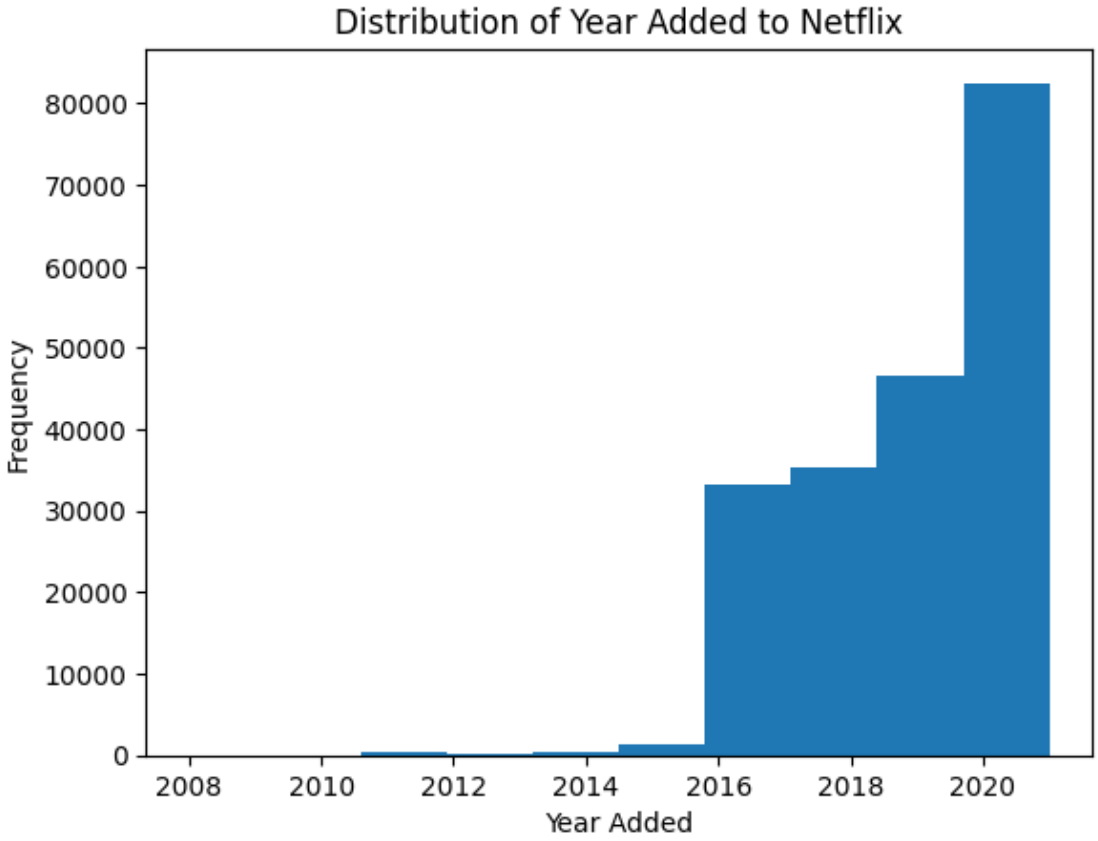
Outliers in release years could indicate unusual content or data anomalies.

Netflix could focus on acquiring more recent TV show releases, diversify content by including a mix of new and classic titles and investigate outliers for insights into content decisions or data quality

Graphical Analysis based on Histogram:

[ ]:
```
import matplotlib.pyplot as plt

plt.hist(cleaned_data['year_added'], bins=10)
plt.xlabel('Year Added')
plt.ylabel('Frequency')
plt.title('Distribution of Year Added to Netflix')
plt.show()
```



Analysis of frequency and year added using Histogram:

Netflix has seen a significant increase in content additions over recent years, with a peak around 2019.

Recommendation: Leverage this trend by focusing on acquiring and promoting newer content.

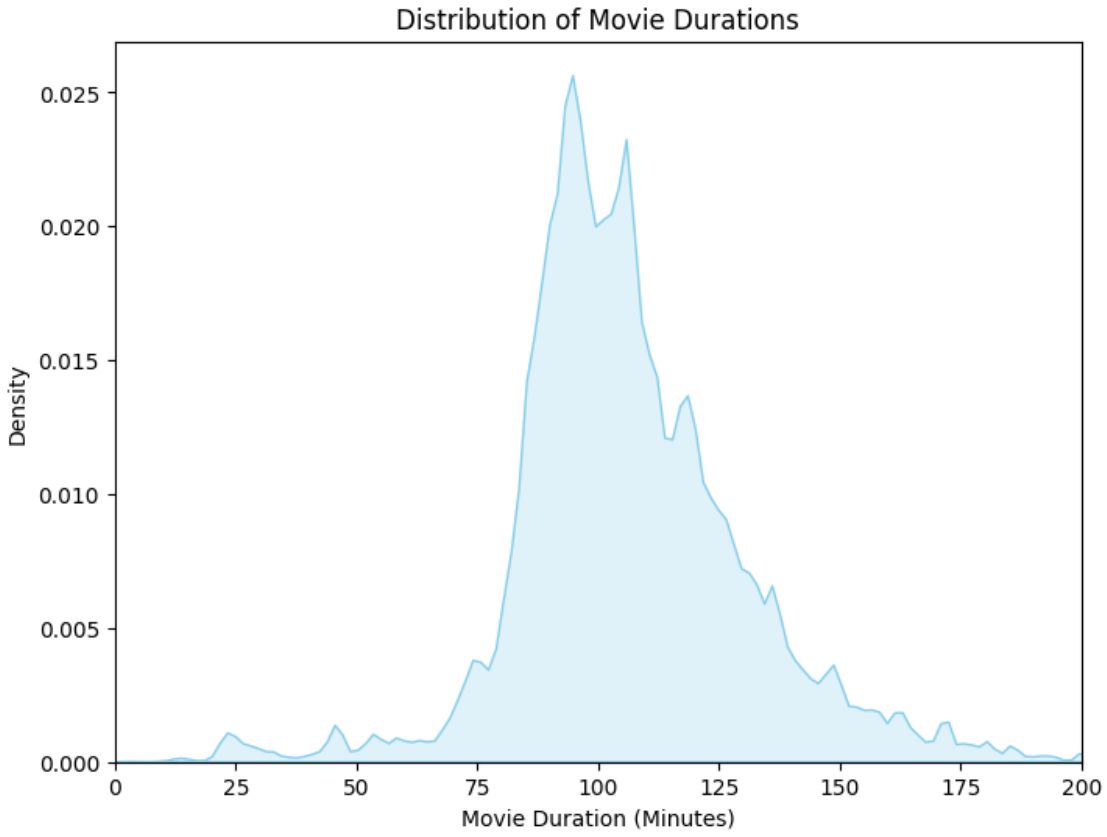
Analyze audience preferences within specific years to further tailor content strategies and recommendations for user engagement.

Consider expanding content libraries with a balance of both recent and classic titles to cater to diverse viewer interests.

KDE analysis of Movie minutes:

```
[ ]: import seaborn as sns
     import matplotlib.pyplot as plt

     plt.figure(figsize=(8, 6))
     sns.kdeplot(data=cleaned_data, x='Movie_Minutes', fill=True, color='skyblue',␣
      ↪bw_adjust=0.5)
     plt.title('Distribution of Movie Durations')
     plt.xlabel('Movie Duration (Minutes)')
     plt.ylabel('Density')
     plt.xlim(0, 200)
     plt.show()
```



Analysis of Movie minutes using KDE plot:

Most movies on Netflix have durations clustered around 90-100 minutes, with a gradual decrease in density for longer films.

Recommendation: Focus on acquiring movies within the popular duration range to cater to viewer preferences. Consider offering more diverse content with shorter or longer durations to expand audience reach. Analyze genre-specific duration preferences to further optimize content acquisition.

Promote movie duration as a search/filter option to enhance user experience.

Overall Insights:

Here's a detailed overview of the analysis I've performed on the Netflix dataset, broken down into steps:

1. Data Cleaning and Preparation: I started by importing the necessary libraries like pandas and downloaded the Netflix dataset using gdown and then performed data cleaning steps such as:

a) Handling missing values by replacing them with appropriate placeholders (e.g., 'unknown_director', 'unknown_actor').

b) Splitting comma-separated values in columns like 'director', 'cast', 'country', and 'listed_in' to create separate rows for each item.

c) Extracting numerical duration from the 'duration' column and creating separate columns for duration value and type (minutes or seasons).

d) Merging the cleaned dataframes into a single 'cleaned_data' dataframe.

e) Dropping duplicate rows.

2. Univariate Analysis (Counts and Distributions)

I've analyzed the frequency distributions of categorical variables such as 'director', 'cast', 'country', 'listed_in' and 'type' using both:

Non-graphical methods: Calculating and printing value counts.

Graphical methods: Creating bar plots to visualize the distributions, focusing on the top categories.

3. Bivariate Analysis (Relationships and Comparisons)

I've explored relationships between variables, including:

a) Comparing movie and TV show production by country.

b) Identifying top actors and directors for both movies and TV shows.

c) Analyzing the most watched genres in India.

d) Determining the average duration of horror movies.

e) Finding the TV show with the most seasons.

f) Examining the growing trend of movie releases in India over time using a line plot.

g) Analyzing the most recently added genres.

h) Comparing the proportion of movies released in India and the United States using a pie chart.

i) Identifying the year with the most movies added to Netflix.

j) Investigating actors who have acted in multiple genres.

k) Determining the months with the most releases for both TV shows and movies.

l) Identifying the correlation between movie release year and duration.

m) Finding relationship between type (Movie or TV Show) and release year.

n) Analyzing frequency and year added by Netflix.

o) Examining the length of movie minutes.

4. Key Insights and Recommendations

I've derived several insights from my analysis, including observations about top countries, directors, actors, genres and release trends.

I've provided recommendations for Netflix based on these insights, such as focusing on specific countries, genres or actors to attract more subscribers and increase viewership.

5. Visualization and Reporting

I effectively used visualizations (bar plots, line plots, pie charts) to present my findings in a clear and understandable manner.

I documented my analysis with Markdown cells, explaining the steps, insights and recommendations.

Overall, I've conducted a comprehensive data analysis of the Netflix dataset, starting from data cleaning to deriving valuable insights and providing actionable recommendations.

I've also effectively used a combination of techniques and visualizations to support my findings.

About Outlier treatment:

The Netflix analysis focused on initial exploration and visualization, where outlier treatment wasn't the main priority.

Extreme values might be valid in this context or implicitly handled by the chosen methods.

Outlier treatment is often more crucial for predictive modeling, which might be a later step.

The large dataset size could also reduce the impact of outliers on overall insights.