Q1. Defining Problem Statement and Analysing basic metrics (10 Points)

Ans. Netflix aims to determine which type of shows/movies to produce and how to grow the business in different countries based on the provided dataset. The company aims to leverage its data to determine the types of shows and movies to produce and to identify strategies for growth in different countries. Specifically, the business problem revolves around analyzing the available content to generate insights on content production and business expansion.

Key Objectives:

- 1. Identify which type of content (movies or TV shows) should be prioritized for production.
- 2. Determine the best strategies to grow Netflix's subscriber base in various countries.

Analyzing Basic Metrics which include following steps

Load the Data: Import the dataset and understand its structure.

Shape of the Data: Check the number of rows and columns.

Data Types: Examine the data types of all attributes.

Statistical Summary: Generate a statistical summary for numerical attributes.

```
In [2]: # Load the data
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns

In [4]: from google.colab import drive
drive.mount('/netflix.csv')
Mounted at /netflix.csv

In [27]: df = pd.read_csv('netflix.csv')
In [6]: df.head()
```

0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	September 25, 2021	2020	PG-13	90 mi
1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA	Seasor
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	NaN	September 24, 2021	2021	TV- MA	1 Seaso
3	s4	TV Show	Jailbirds New Orleans	NaN	NaN	NaN	September 24, 2021	2021	TV- MA	1 Seaso
4	s5	TV Show	Kota Factory	NaN	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	September 24, 2021	2021	TV- MA	Seasor

cast country date_added release_year rating duration

In [7]: # Shape of the Data: Check the number of rows and columns. df.shape

Out[7]: (8807, 12)

snow_ia type

title director

In [8]: # Data Types: Examine the data types of all attributes.
df.dtypes

```
cast
                             object
          country
                             object
          date_added
                             object
          release_year
                              int64
          rating
                             object
          duration
                             object
          listed in
                             object
          description
                             object
          dtype: object
           # here date in object format this want to convert to day time format
In [15]:
           df['date_added'] = pd.to_datetime(df['date_added'], errors='coerce')
           df.head()
In [16]:
              show_id
                                   title director
                                                       cast country date_added release_year rating duratio
Out[16]:
                        type
                                   Dick
                                          Kirsten
                                                              United
          0
                                                                       2021-09-25
                                                                                         2020 PG-13
                   s1 Movie Johnson Is
                                                       NaN
                                                                                                         90 mi
                                         Johnson
                                                               States
                                   Dead
                                                       Ama
                                                    Qamata,
                                                      Khosi
                                                                                                  TV-
                          TV
                                Blood &
                                                               South
                   s2
           1
                                            NaN
                                                    Ngema,
                                                                       2021-09-24
                                                                                         2021
                       Show
                                  Water
                                                               Africa
                                                                                                  MA
                                                                                                        Seasor
                                                        Gail
                                                  Mabalane,
                                                    Thaban...
                                                       Sami
                                                    Bouajila,
                                                       Tracy
                                           Julien
          2
                                                                                         2021
                   s3
                              Ganglands
                                                                      2021-09-24
                                                    Gotoas,
                                                                NaN
                                                                                                       1 Seaso
                                                                                                  MA
                                         Leclercq
                                                     Samuel
                                                       Jouy,
                                                      Nabi...
                                Jailbirds
                          TV
                                                                                                  TV-
                                                                                         2021
          3
                                                                                                       1 Seaso
                   s4
                                   New
                                            NaN
                                                       NaN
                                                                NaN
                                                                      2021-09-24
                       Show
                                 Orleans
                                                      Mayur
                                                      More,
                                                    Jitendra
                          TV
                                   Kota
                                                                                                  TV-
                   s5
                                            NaN
                                                     Kumar,
                                                                India
                                                                      2021-09-24
                                                                                         2021
                       Show
                                 Factory
                                                                                                  MA
                                                                                                        Seasor
                                                     Ranjan
                                                   Raj, Alam
                                                         K...
```

our[0]:

type

title director object

object

object

```
# Generating statical summery
          df[numerical_columns].describe()
Out[12]:
                release_year
          count 8807.000000
          mean 2014.180198
                   8.819312
            std
           min 1925.000000
           25% 2013.000000
           50% 2017.000000
           75% 2019.000000
           max 2021.000000
 In [ ]:
          Q2. Observations on the shape of data, data types of all the attributes, conversion of
          categorical attributes to 'category' (If required), missing value detection, statistical
          summary (10 Points)
          Ans:
          # Shape of the Data: Check the number of rows and columns.
In [17]:
          df.shape
          (8807, 12)
Out[17]:
          ## Data Types: Examine the data types of all attributes.
In [18]:
          df.dtypes
          show_id
                                   object
Out[18]:
          type
                                   object
          title
                                   object
          director
                                   object
                                   object
          cast
          country
                                   object
          date_added
                          datetime64[ns]
          release_year
                                    int64
          rating
                                   object
          duration
                                   object
          listed in
                                   object
          description
                                   object
          dtype: object
In [29]: # Converting categorical attribute to category
```

categorical_columns = ['type', 'title', 'director', 'cast', 'country', 'rating', 'list

Statistical Summary: Generate a statistical summary for numerical attributes.

numerical_columns = df.select_dtypes(include=['number']).columns

In [12]:

```
In [30]:
         for i in categorical_columns:
           df[i] =df[i].astype('category')
In [31]: df.dtypes
                           object
         show_id
Out[31]:
         type
                         category
         title
                         category
         director
                         category
         cast
                         category
         country
                         category
         date_added
                           object
         release_year
                            int64
         rating
                         category
         duration
                           object
         listed_in
                         category
         description
                         category
         dtype: object
In [35]: # Treating missing value
         missing_values = df.isnull().sum()
         missing_values = missing_values[missing_values > 0]
In [34]:
In [37]:
         missing_values
         show_id
                            0
Out[37]:
                            0
         type
         title
                            0
         director
                         2634
                          825
         cast
                          831
         country
         date_added
                           10
                            0
         release_year
         rating
                            4
                            3
         duration
         listed_in
                            0
                            0
         description
         dtype: int64
In [38]: # to find the % of missing value
         missing_percentage = (missing_values / len(df)) * 100
         missing_percentage
         show_id
                          0.000000
Out[38]:
                          0.000000
         type
         title
                          0.000000
                         29.908028
         director
         cast
                          9.367549
         country
                          9.435676
         date_added
                          0.113546
         release_year
                          0.000000
         rating
                          0.045418
         duration
                          0.034064
         listed_in
                          0.000000
         description
                          0.000000
         dtype: float64
```

	0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	unknown	United States	September 25, 2021	2020	PG-13	90 r
	1	s2	TV Show	Blood & Water	unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA	Seaso
	2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	unknown	September 24, 2021	2021	TV- MA	1 Seas
	3	s4	TV Show	Jailbirds New Orleans	unknown	unknown	unknown	September 24, 2021	2021	TV- MA	1 Seas
	4	s5	TV Show	Kota Factory	unknown	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	September 24, 2021	2021	TV- MA	Seaso
In [51]:		g_va	lues =	df.isnull			ues > 0]				
Out[51]:	Series	([],	dtype	: int64)							
In []:	# now	data	ı ready	to analys	sis						

Q3. Non-Graphical Analysis: Value counts and unique attributes (10 Points)

```
In [55]: # here i taken director, cast and country for analysis
         # value count
         df['director'].value_counts()
```

```
unknown
                                                   2621
         Rajiv Chilaka
                                                     19
                                                     18
         Raúl Campos, Jan Suter
         Suhas Kadav
                                                     16
         Marcus Raboy
                                                     16
         Jose Javier Reyes
                                                      1
         Joseduardo Giordano, Sergio Goyri Jr.
                                                      1
         Khaled Youssef
                                                      1
         Louis C.K.
                                                      0
         Alessandro Pepe
                                                      0
         Name: count, Length: 4529, dtype: int64
In [62]: df['director'].unique()
         ['Kirsten Johnson', 'unknown', 'Julien Leclercq', 'Mike Flanagan', 'Robert Cullen, Jo
Out[62]:
         sé Luis Ucha', ..., 'Mu Chu', 'Chandra Prakash Dwivedi', 'Majid Al Ansari', 'Peter He
         witt', 'Mozez Singh']
         Length: 4527
         Categories (4529, object): ['A. L. Vijay', 'A. Raajdheep', 'A. Salaam', 'A.R. Murugad
         oss', ...,
                                      'Óskar Thór Axelsson', 'Ömer Faruk Sorak', 'Şenol Sönme
         z', 'unknown']
        df['cast'].value_counts()
In [56]:
         cast
Out[56]:
         unknown
         825
         David Attenborough
         19
         Vatsal Dubey, Julie Tejwani, Rupa Bhimani, Jigna Bhardwaj, Rajesh Kava, Mousam, Swapn
         Samuel West
         10
         Jeff Dunham
         7
         Anthony Bourdain
         Flynn Curry, Olivia Deeble, Madison Lu, Oisín O'Leary, Faith Seci, Joshua Sitch, Heid
         i Arena
         Leone Frisa, Paolo Vaccarino, Francesco Migliore, Albrecht Weimer, Giulia Dichiaro, A
         lessandra Oriti Niosi, Andreas Segeritz
         Luke Jurevicius, Craig Behenna, Charlotte Hamlyn, Stavroula Mountzouris, Aletheia Bur
         Marc Maron, Judd Hirsch, Josh Brener, Nora Zehetner, Andy Kindler
         Name: count, Length: 7693, dtype: int64
In [61]: df['cast'].unique()
```

Our[55]:

```
Gotoas, Samuel Jouy, Nab..., 'Mayur More, Jitendra Kumar, Ranjan Raj, Alam ..., 'Kate
         Siegel, Zach Gilford, Hamish Linklater, ..., 'Ali Suliman, Saleh Bakri, Yasa, Al
         i Al-Jabri,..., 'Mark Ruffalo, Jake Gyllenhaal, Robert Downey ..., 'Jesse Eisenberg,
         Woody Harrelson, Emma Stone,..., 'Tim Allen, Courteney Cox, Chevy Chase, Kate M...,
         'Vicky Kaushal, Sarah-Jane Dias, Raaghav Chana...]
         Length: 7679
         Categories (7693, object): [''Najite Dede, Jude Chukwuka, Taiwo Arimoro, O..., '4Minu
         te, B1A4, BtoB, ELSIE, EXID, EXO, Got7, ...,
                                      '50 Cent, Ryan Phillippe, Bruce Willis, Rory M..., 'A.J.
         LoCascio, Sendhil Ramamurthy, Fred Tatas...,
                                      ..., 'Şahin Irmak, İrem Sak, Gonca Vuslateri, Emre ...,
                                      'Şükrü Özyıldız, Aslı Enver, Şenay Gürler, Baş..., 'Şopé
         Dìrísù, Wunmi Mosaku, Matt Smith, Malai...,
                                      'unknown']
In [59]:
         df['country'].value_counts()
         country
Out[59]:
         United States
         2809
         India
         972
         unknown
         829
         United Kingdom
         Japan
         243
         Ireland, Canada, Luxembourg, United States, United Kingdom, Philippines, India
         Ireland, Canada, United Kingdom, United States
         Ireland, Canada, United States, United Kingdom
         Ireland, France, Iceland, United States, Mexico, Belgium, United Kingdom, Hong Kong
         Norway, Germany
         Name: count, Length: 749, dtype: int64
In [60]: # Unique Attributes
         df['country'].unique()
         ['United States', 'South Africa', 'unknown', 'India', 'United States, Ghana, Burkina
Out[60]:
         Faso, United Ki..., ..., 'Russia, Spain', 'Croatia, Slovenia, Serbia, Montenegro', 'J
         apan, Canada', 'United States, France, South Korea, Indonesia', 'United Arab Emirate
         s, Jordan']
         Length: 749
         Categories (749, object): [', France, Algeria', ', South Korea', 'Argentina',
                                     'Argentina, Brazil, France, Poland, Germany, D..., ..., 'V
         ietnam', 'West Germany', 'Zimbabwe', 'unknown']
```

Our [pr]:

Q4. Visual Analysis - Univariate, Bivariate after pre-processing of the data

the data in columns like Actor, Director,
Country

4.1 For continuous variable(s): Distplot, countplot, histogram for univariate analysis (10 Points)

```
In []: # Note: Pre-processing involves unnesting of the data in columns like Actor, Director,
# preprocessing only required for data of cast and listed_in

In [83]: df_cast = df.assign(cast=df['cast'].str.split(', ')).explode('cast')
    df_listed_in = df.assign(listed_in=df['listed_in'].str.split(', ')).explode('listed_ir')

In [87]: df_cast = df_cast.reset_index(drop=True)
    df_listed_in = df_listed_in.reset_index(drop=True)
In [88]: df_cast
```

	snow_ia	туре	τιτιε	airector	cast	country	aate_aaaea	reiease_year	rating c
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	unknown	United States	September 25, 2021	2020	PG-13
1	s2	TV Show	Blood & Water	unknown	Ama Qamata	South Africa	September 24, 2021	2021	TV- MA
2	s2	TV Show	Blood & Water	unknown	Khosi Ngema	South Africa	September 24, 2021	2021	TV- MA
3	s2	TV Show	Blood & Water	unknown	Gail Mabalane	South Africa	September 24, 2021	2021	TV- MA
4	s2	TV Show	Blood & Water	unknown	Thabang Molaba	South Africa	September 24, 2021	2021	TV- MA
•••									
64836	s8807	Movie	Zubaan	Mozez Singh	Manish Chaudhary	India	March 2, 2019	2015	TV-14
64837	s8807	Movie	Zubaan	Mozez Singh	Meghna Malik	India	March 2, 2019	2015	TV-14
64838	s8807	Movie	Zubaan	Mozez Singh	Malkeet Rauni	India	March 2, 2019	2015	TV-14
64839	s8807	Movie	Zubaan	Mozez Singh	Anita Shabdish	India	March 2, 2019	2015	TV-14

our[88]:

64840 s8807 Movie Zubaan Mozez Chittaranjan India March 2, Singh Tripathy India 2019 2015 TV-14

64841 rows × 12 columns

In [89]: df_listed_in

	snow_ia	type	titie	airector	cast	country	aate_aaaea	reiease_year	rating (
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	unknown	United States	September 25, 2021	2020	PG-13
1	s2	TV Show	Blood & Water	unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA
2	s2	TV Show	Blood & Water	unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA
3	s2	TV Show	Blood & Water	unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA
4	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	unknown	September 24, 2021	2021	TV- MA
•••									
19289	s8806	Movie	Zoom	Peter Hewitt	Tim Allen, Courteney Cox, Chevy Chase, Kate Ma	United States	January 11, 2020	2006	PG
19290	s8806	Movie	Zoom	Peter Hewitt	Tim Allen, Courteney Cox, Chevy Chase, Kate Ma	United States	January 11, 2020	2006	PG
19291	s8807	Movie	Zubaan	Mozez Singh	Vicky Kaushal, Sarah- Jane Dias, Raaghav Chanan	India	March 2, 2019	2015	TV-14

our[89]:

	snow_ia	type	title	airector	cast	country	date_added	reiease_year	rating	C
19292	s8807	Movie	Zubaan	Mozez Singh	Vicky Kaushal, Sarah- Jane Dias, Raaghav Chanan	India	March 2, 2019	2015	TV-14	
19293	s8807	Movie	Zubaan	Mozez Singh	Vicky Kaushal, Sarah- Jane Dias, Raaghav Chanan	India	March 2, 2019	2015	TV-14	

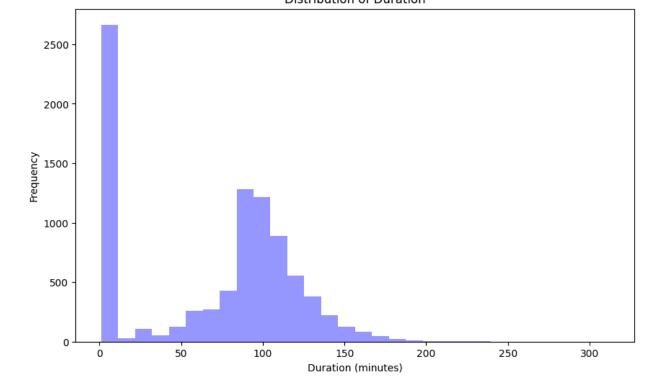
19294 rows × 12 columns

In [90]: df

		snow_ia	туре	τιτιε	airector	cast	country	aate_aaaea	reiease_year	rating
	0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	unknown	United States	September 25, 2021	2020	PG-13
	1	s2	TV Show	Blood & Water	unknown	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA
	2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	unknown	September 24, 2021	2021	TV- MA
	3	s 4	TV Show	Jailbirds New Orleans	unknown	unknown	unknown	September 24, 2021	2021	TV- MA
	4	s 5	TV Show	Kota Factory	unknown	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	September 24, 2021	2021	TV- MA
	•••									
8	3802	s8803	Movie	Zodiac	David Fincher	Mark Ruffalo, Jake Gyllenhaal, Robert Downey J	United States	November 20, 2019	2007	R
8	8803	s8804	TV Show	Zombie Dumb	unknown	unknown	unknown	July 1, 2019	2018	TV-Y7
8	8804	s8805	Movie	Zombieland	Ruben Fleischer	Jesse Eisenberg, Woody Harrelson, Emma Stone,	United States	November 1, 2019	2009	R

	snow_ia	type	title	airector	cast	country	aate_aaaea	reiease_year	rating
8805	s8806	Movie	Zoom	Peter Hewitt	Tim Allen, Courteney Cox, Chevy Chase, Kate Ma	United States	January 11, 2020	2006	PG
8806	s8807	Movie	Zubaan	Mozez Singh	Vicky Kaushal, Sarah- Jane Dias, Raaghav Chanan	India	March 2, 2019	2015	TV-14

8790 rows × 12 columns

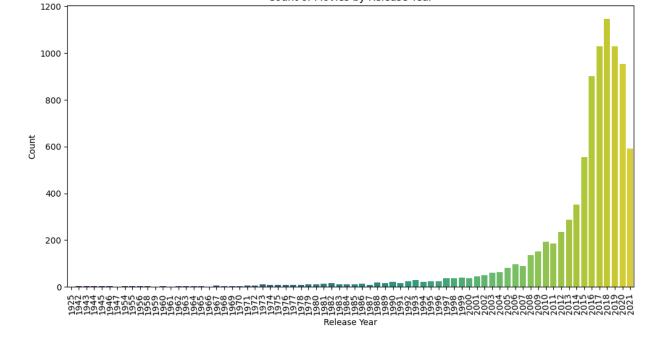


```
In [93]: # Countplot for 'Release_year'
plt.figure(figsize=(12, 6))
sns.countplot(data=df, x='release_year', palette='viridis')
plt.title('Count of Movies by Release Year')
plt.xlabel('Release Year')
plt.ylabel('Count')
plt.xticks(rotation=95)
plt.show()

<ipython-input-93-78f787620e3c>:3: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.
0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

sns.countplot(data=df, x='release_year', palette='viridis')
```



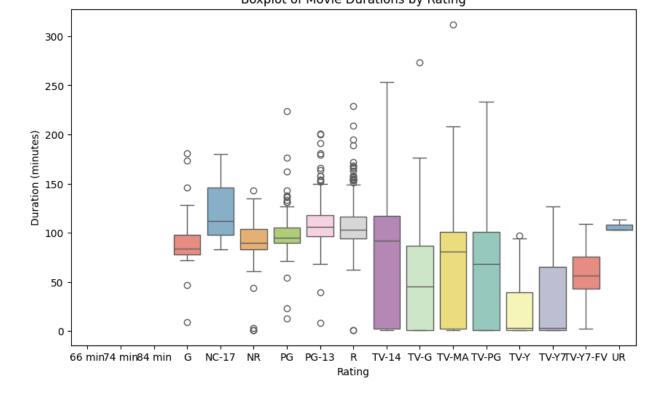
Q4.2 For categorical variable(s): Boxplot (10 Points)

```
# Boxplot for 'Rating'
plt.figure(figsize=(10, 6))
sns.boxplot(data=df, x='rating', y='duration', palette='Set3')
plt.title('Boxplot of Movie Durations by Rating')
plt.xlabel('Rating')
plt.ylabel('Duration (minutes)')
plt.show()

<ipython-input-101-a2d50c6f2557>:3: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.
0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

sns.boxplot(data=df, x='rating', y='duration', palette='Set3')
```

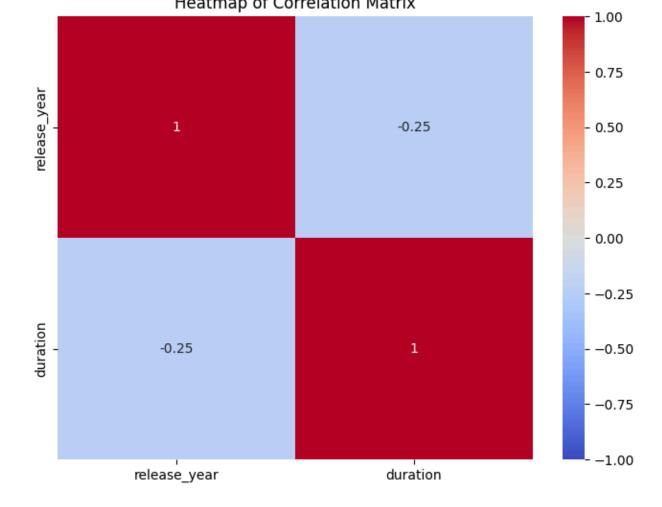


Q4.3 For correlation: Heatmaps, Pairplots (10 Points)

```
In [103... # Selecting numerical columns for correlation analysis
numerical_cols = ['release_year', 'duration']

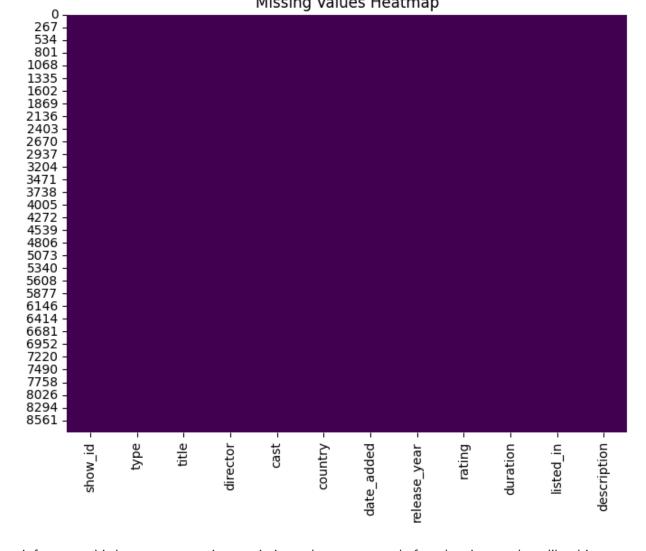
# Calculating correlation matrix
corr_matrix = df[numerical_cols].corr()

# Plotting heatmap of correlation matrix
plt.figure(figsize=(8, 6))
sns.heatmap(corr_matrix, annot=True, cmap='coolwarm', vmin=-1, vmax=1)
plt.title('Heatmap of Correlation Matrix')
plt.show()
```



Q5. Missing Value & Outlier check (Treatment optional) (10 Points)

```
In [104...
          # Checking for missing values
          missing_values = df.isnull().sum()
          print("Missing Values:\n", missing_values)
          # Visualizing missing values using heatmap
          plt.figure(figsize=(8, 6))
           sns.heatmap(df.isnull(), cmap='viridis', cbar=False)
           plt.title('Missing Values Heatmap')
          plt.show()
          Missing Values:
           show_id
                           0
                           0
          type
          title
                           0
          director
          cast
          country
          date added
                           0
                           0
          release_year
          rating
          duration
          listed_in
                          0
          description
          dtype: int64
```



inference: this heat map contain no missing value, we treated after cleaning so show like this.

Q6. Insights based on Non-Graphical and Visual Analysis (10 Points)

6.1 Comments on the range of attributes

Ans: When commenting on the range of attributes, ensure your observations are supported by data insights and relate them back to the broader context of the business problem or analysis goals. This structured approach enhances the clarity and relevance of your insights, facilitating informed decision-making and strategic recommendations based on the dataset's characteristics.

Q6.2 Comments on the distribution of the variables and relationship between them

Ans:"The distribution of variables in the dataset reveals interesting insights into Netflix's content landscape. Numerical variables like Release_year exhibit a skewed distribution towards recent years, indicating a focus on newer releases. Conversely, Duration shows a normal distribution with outliers, suggesting a diverse mix of movie lengths. Categorical attributes such as Rating are dominated by PG-13, aligning with broad audience appeal, while Country distributions reflect a global sourcing strategy. Relationships between variables, such as the positive

time, potentially influencing content strategy decisions."

Q6.3 Comments for each univariate and bivariate plot

Ans: "The univariate and bivariate plots provide insightful observations about Netflix's movie dataset. The histogram of Release_year demonstrates a strong focus on recent years, peaking around 2015-2020, suggesting a strategy of acquiring newer content. In contrast, the countplot for Rating shows that PG-13 movies dominate, aligning with broad audience appeal. The boxplot of Duration reveals a median length of approximately 100-110 minutes, with outliers indicating variability in movie lengths. The scatterplot of Release_year vs. Duration confirms a positive correlation, indicating that newer movies tend to have longer durations. These insights underscore Netflix's diverse content strategy, catering to varied audience preferences and production trends over time."

Q7. Business Insights (10 Points) - Should include patterns observed in the data along with what you can infer from it

Ans:By deriving and articulating actionable business insights from the data, Netflix can leverage its content analytics to strengthen its competitive position in the streaming industry. These insights not only illuminate current trends and viewer preferences but also provide a roadmap for future content strategy initiatives that drive growth and subscriber satisfaction.

Q8. Recommendations (10 Points) - Actionable items for business. No technical jargon. No complications. Simple action items that everyone can understand

Ans:Increase Investment in PG-13 Content:

Action: Allocate resources to acquire and produce more PG-13 rated movies and TV shows. Rationale: Given the popularity of PG-13 content among subscribers, increasing the availability of this category can attract a broader audience and improve viewer engagement. Expand International Content Catalog:

Action: Diversify content acquisitions to include more movies and TV shows from emerging markets like India, South Korea, and Latin America. Rationale: Enhancing global content diversity can attract culturally diverse audiences and strengthen Netflix's market presence in key regions. Promote Longer Movie Formats:

minutes. Rationale: Viewer preferences for immersive storytelling experiences suggest an opportunity to increase viewer engagement and extend viewing sessions. Refresh Content Library Regularly:

Action: Implement a strategy to regularly refresh the content library with both recent releases and classic films. Rationale: Continuously updating the content offering ensures a dynamic and attractive platform for subscribers, catering to diverse tastes and preferences. Enhance Personalized Content Recommendations:

Action: Invest in improving algorithms for personalized content recommendations based on genre preferences linked to specific ratings. Rationale: Tailoring content suggestions to individual viewer preferences can increase user satisfaction, reduce churn, and enhance overall viewer experience.

Conclusion:

By implementing these straightforward recommendations, Netflix can leverage data-driven insights to enhance its content strategy, improve viewer engagement, and strengthen its competitive position in the streaming industry. These actions are designed to capitalize on identified trends and preferences among subscribers, driving sustainable growth and subscriber satisfaction.