

```
In [1]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
```

```
In [128]: import warnings
warnings.filterwarnings("ignore")
```

```
In [129]: df = pd.read_csv("netflix.csv")
```

```
In [130]: df.head(3)
```

Out[130]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	duration	listed_in	description
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	September 25, 2021	2020	PG-13	90 min	Documentaries	As her father nears the end of his life, filmm...
1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mablane, Thaban...	South Africa	September 24, 2021	2021	TV-MA	2 Seasons	International TV Shows, TV Dramas, TV Mysteries	After crossing paths at a party, a Cape Town t...
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...	NaN	September 24, 2021	2021	TV-MA	1 Season	Crime TV Shows, International TV Shows, TV Act...	To protect his family from a powerful drug lor...

1. Defining Problem Statement and Analysing basic metrics

1. Problem Statement

- Analyze the netflix dataset to provide data-driven recommendation on the type of content (movies or TV shows) to produce.
- Explore how Netflix can expand and grow its business in different countries.

2. Basic metric Analysis

- a. Import the dataset and load it into a suitable data structure for analysis.
- b. Check the data for any missing values, duplicates and handle them.
- c. Analyse the overall distribution of content types (movies, tv shows) to see if netflix has a preference.
- d. Calculate the total number of movies and tv shows available on Netflix.
- e. Analyze the tv ratings of the content to see if there is a particular rating that performs better.
- f. Determine the average duration (in minutes) of movies and the average number of seasons for TV shows.

3. Content by country:

- a. Analyze which countries produce the most content for Netflix.
- b. Analyze which types of contents are most popular in specific countries.

4. Launch time or date for tv shows and movies:

- a. Examine the release dates and time of tv shows to determine if there is a season or time of the year that tends to perform better.

5. Actor and Director Analysis:

- a. Identify most popularly appearing actors and directors in Netflix content.
- b. Determine the specific actors and directors are associated with higher ratings.

6. Focus on TV Shows or Movies:

- a. Analyze which types of contents (TV Shows or Movies) is more producing in recent years.

7. Growth Strategies:

- a. Provide recommendation for Netflix on expanding its business in different countries based on content preferences, regional trends and potential market opportunities.

2. 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

```
In [131]: print(df.shape)
print(f"Dataset contains {df.shape[0]} rows and {df.shape[1]} columns")
```

```
(8807, 12)
Dataset contains 8807 rows and 12 columns
```

```
In [132]: print("Data types of Attribute: ")
print(df.dtypes)
```

```
Data types of Attribute:
show_id      object
type         object
title        object
director     object
cast         object
country      object
date_added   object
release_year  int64
rating       object
duration     object
listed_in    object
description   object
dtype: object
```

```
In [133]: df.columns
```

```
Out[133]: Index(['show_id', 'type', 'title', 'director', 'cast', 'country', 'date_added',
               'release_year', 'rating', 'duration', 'listed_in', 'description'],
              dtype='object')
```

```
In [134]: df.isnull().sum()
```

```
Out[134]: show_id      0
type              0
title            0
director        2634
cast            825
country         831
date_added       10
release_year      0
rating           4
duration         3
listed_in        0
description       0
dtype: int64
```

Statistical Summery

```
In [135]: df.describe()
```

```
Out[135]:
```

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

```
In [136]: df.describe(include = "object")
```

```
Out[136]:
```

	show_id	type	title	director	cast	country	date_added	rating	duration	listed_in	description
count	8807	8807	8807	6173	7982	7976	8797	8803	8804	8807	8807
unique	8807	2	8807	4528	7692	748	1767	17	220	514	8775
top	s1	Movie	Dick Johnson Is Dead	Rajiv Chilaka	David Attenborough	United States	January 1, 2020	TV-MA	1 Season	Dramas, International Movies	Paranormal activity at a lush, abandoned prope...
freq	1	6131	1	19	19	2818	109	3207	1793	362	4

• Missing Value Treatment

```
In [137]: df_missing = pd.DataFrame({"Missing_values": df.isnull().sum(), "Percentage": round(df.isnull().sum()/len(df)*100, 2)})
```

In [138]: df_missing

Out[138]:

	Missing_values	Percentage
show_id	0	0.00
type	0	0.00
title	0	0.00
director	2634	29.91
cast	825	9.37
country	831	9.44
date_added	10	0.11
release_year	0	0.00
rating	4	0.05
duration	3	0.03
listed_in	0	0.00
description	0	0.00

```
In [139]: # fill null values with a specific values:
df['director'].fillna("Unknown director",inplace=True)
df['cast'].fillna("Unknown cast",inplace=True)
df['country'].fillna("Unknown country",inplace=True)
df['date_added'].fillna("January 1,1900",inplace=True)
df['duration'].fillna("Unknown duration",inplace=True)
df['rating'].fillna("Unknown rating",inplace=True)
```

In [140]: df.isnull().sum()

```
Out[140]: show_id      0
type            0
title           0
director        0
cast            0
country         0
date_added      0
release_year    0
rating          0
duration        0
listed_in       0
description     0
dtype: int64
```

- When we converted categorical columns to category, internally stores them as integer codes instead of full strings.
- Saves memory by encoding repeated strings as numbers.
- Faster grouping, sorting, and aggregations.
- Prevents invalid category values

```
In [141]: df["type"] = df["type"].astype("category")
df["country"] = df["country"].astype("category")
df["rating"] = df["rating"].astype("category")
```

In [142]: df.dtypes

```
Out[142]: show_id      object
type            category
title           object
director        object
cast            object
country         category
date_added      object
release_year    int64
rating          category
duration        object
listed_in       object
description     object
dtype: object
```

3. Non-Graphical Analysis: Value counts and unique attributes

In [143]: df.columns

```
Out[143]: Index(['show_id', 'type', 'title', 'director', 'cast', 'country', 'date_added',
               'release_year', 'rating', 'duration', 'listed_in', 'description'],
              dtype='object')
```

```
In [144]: df["type"].value_counts()
```

```
Out[144]: Movie      6131
TV Show    2676
Name: type, dtype: int64
```

```
In [198]: df1[df1["type"] == "TV Show"]["duration"].value_counts()
```

```
Out[198]: 1 Season      1793
2 Seasons    425
3 Seasons    199
4 Seasons     95
5 Seasons     65
6 Seasons     33
7 Seasons     23
8 Seasons     17
9 Seasons      9
10 Seasons     7
13 Seasons     3
15 Seasons     2
12 Seasons     2
11 Seasons     2
17 Seasons     1
Name: duration, dtype: int64
```

```
In [145]: df["country"].value_counts().head()
```

```
Out[145]: United States    2818
India                    972
Unknown country          831
United Kingdom           419
Japan                     245
Name: country, dtype: int64
```

```
In [146]: df["rating"].value_counts()
```

```
Out[146]: TV-MA      3207
TV-14      2160
TV-PG      863
R          799
PG-13      490
TV-Y7      334
TV-Y       307
PG         287
TV-G       220
NR          80
G          41
TV-Y7-FV    6
Unknown rating 4
NC-17       3
UR          3
74 min      1
84 min      1
66 min      1
Name: rating, dtype: int64
```

```
In [147]: df["listed_in"].value_counts()
```

```
Out[147]: Dramas, International Movies    362
Documentaries                          359
Stand-Up Comedy                        334
Comedies, Dramas, International Movies  274
Dramas, Independent Movies, International Movies 252
...
Kids' TV, TV Action & Adventure, TV Dramas    1
TV Comedies, TV Dramas, TV Horror            1
Children & Family Movies, Comedies, LGBTQ Movies 1
Kids' TV, Spanish-Language TV Shows, Teen TV Shows 1
Cult Movies, Dramas, Thrillers                1
Name: listed_in, Length: 514, dtype: int64
```

```
In [148]: df["release_year"].value_counts()
```

```
Out[148]: 2018    1147
2017    1032
2019    1030
2020     953
2016     902
...
1959      1
1925      1
1961      1
1947      1
1966      1
Name: release_year, Length: 74, dtype: int64
```

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

```
In [149]: # unnesting the columns
df["cast_split"] = df["cast"].str.split(", ")
df = df.explode("cast_split")
df["director_split"] = df["director"].str.split(", ")
df = df.explode("director_split")
df["country_split"] = df["country"].str.split(", ")
df = df.explode("country_split")
df["listed_in_split"] = df["listed_in"].str.split(", ")
df = df.explode("listed_in_split")
```

```
In [150]: df.columns
```

```
Out[150]: Index(['show_id', 'type', 'title', 'director', 'cast', 'country', 'date_added',
               'release_year', 'rating', 'duration', 'listed_in', 'description',
               'cast_split', 'director_split', 'country_split', 'listed_in_split'],
              dtype='object')
```

```
In [151]: df.head()
```

```
Out[151]:
```

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

```
In [152]: df.shape
```

```
Out[152]: (201991, 16)
```

```
In [153]: small_df=df[['show_id','title','release_year','type']]
small_df.head(5)
```

```
Out[153]:
```

	show_id	title	release_year	type
0	s1	Dick Johnson Is Dead	2020	Movie
1	s2	Blood & Water	2021	TV Show
1	s2	Blood & Water	2021	TV Show
1	s2	Blood & Water	2021	TV Show
1	s2	Blood & Water	2021	TV Show

```
In [154]: small_df.drop_duplicates(inplace = True)
```

```
In [155]: df.columns
```

```
Out[155]: Index(['show_id', 'type', 'title', 'director', 'cast', 'country', 'date_added',
               'release_year', 'rating', 'duration', 'listed_in', 'description',
               'cast_split', 'director_split', 'country_split', 'listed_in_split'],
              dtype='object')
```

```
In [156]: df["type"].value_counts()
```

```
Out[156]: Movie      145843
TV Show      56148
Name: type, dtype: int64
```

```
In [157]: movie_count_by_country = df[df["type"] == "Movie"].groupby("country")["title"].nunique().sort_values(ascending = False)
movie_count_by_country
```

```
Out[157]: country
United States      2058
India              893
Unknown country    440
United Kingdom     206
Canada             122
...
Canada, United States, United Kingdom, France, Luxembourg    0
United Kingdom, Australia                                   0
Spain, Germany, Denmark, United States                     0
Chile, Italy                                                 0
Philippines, Singapore, Indonesia                          0
Name: title, Length: 749, dtype: int64
```

```
In [158]: TV_shows_count_country = df[df["type"] == "TV Show"].groupby("country")["title"].nunique().sort_values(ascending = False)
TV_shows_count_country.head(10)
```

```
Out[158]: country
United States      760
Unknown country    391
United Kingdom     213
Japan              169
South Korea        158
India               79
Taiwan              68
Canada              59
France              49
Spain               48
Name: title, dtype: int64
```

```
In [159]: df.dtypes
```

```
Out[159]: show_id      object
type        category
title       object
director    object
cast        object
country     category
date_added  object
release_year int64
rating      category
duration    object
listed_in   object
description object
cast_split  object
director_split object
country_split object
listed_in_split object
dtype: object
```

```
In [160]: df['date_added'] = df['date_added'].str.replace(',', ' ', regex=False) # Ensure space after comma
df['date_added'] = df['date_added'].str.replace(' ', '', regex=False) # Remove double spaces
df['date_added'] = pd.to_datetime(df['date_added'], format='%B %d, %Y', errors='coerce')
df['week_added'] = df['date_added'].dt.strftime('%Y-%U')
```

```
In [161]: tv_shows = df[df['type'] == 'TV Show']
movies = df[df['type'] == 'Movie']

# Split the 'cast' column to create a list of actors
tv_shows['cast_split'] = tv_shows['cast'].apply(lambda x: x.split(', ') if isinstance(x, str) else [])
movies['cast_split'] = movies['cast'].apply(lambda x: x.split(', ') if isinstance(x, str) else [])
```

```
In [162]: all_actors = [actor for i in movies['cast_split'] for actor in i]

actor_counts = pd.Series(all_actors).value_counts().reset_index()
actor_counts.columns = ['Actor', 'Appearances']

top_10_actors = actor_counts.head(11)

print("Top 10 Actors with frequently Appearances in movies:")
print(top_10_actors)
```

Top 10 Actors with frequently Appearances in movies:

	Actor	Appearances
0	Unknown cast	1328
1	Alfred Molina	1255
2	Liam Neeson	1244
3	Anupam Kher	1122
4	Salma Hayek	1092
5	John Krasinski	1072
6	James Franco	1058
7	Halle Berry	1057
8	Paul Giamatti	1026
9	Shah Rukh Khan	1007
10	Jim Broadbent	998

```
In [163]: all_actors = [actor for i in tv_shows["cast_split"] for actor in i]
actor_count = pd.Series(all_actors).value_counts().reset_index()
actor_count.columns = ["Actor", "Appearance"]
print("Top 10 actor with frequency appearence in TV shows")
actor_count.head(11)
```

Top 10 actor with frequency appearence in TV shows

Out[163]:

	Actor	Appearance
0	Takahiro Sakurai	843
1	Unknown cast	818
2	Yuichi Nakamura	732
3	Jun Fukuyama	679
4	Yuki Kaji	674
5	Junichi Suwabe	624
6	Hiroshi Kamiya	608
7	Raúl Méndez	597
8	Daisuke Ono	583
9	André Holland	536
10	Ai Kayano	535

```
In [164]: tv_show["director_split"] = tv_show["director"].apply(lambda x:x.split(", ") if isinstance(x, str) else [])
movies["director_split"] = movies["director"].apply(lambda x:x.split(", ") if isinstance(x, str) else [])
```

```
In [165]: all_director = [director for i in movies["director_split"] for director in i]
director_count = pd.Series(all_director).value_counts().reset_index()
director_count.columns = ["director", "appearance"]
print("Top 10 director frequency in appearance")
print(director_count.head(11))
```

Top 10 director frequency in appearance

	director	appearance
0	Unknown director	1285
1	Roger Allers	935
2	Joann Sfar	700
3	Bill Plympton	700
4	Nina Paley	700
5	Tomm Moore	700
6	Mohammed Saeed Harib	700
7	Joan C. Gratz	700
8	Paul Brizzi	700
9	Gaëtan Brizzi	700
10	Michael Socha	700

```
In [166]: all_director = [director for i in tv_show["director_split"] for director in i]
director_count = pd.Series(all_director).value_counts().reset_index()
director_count.columns = ["director", "appearence"]
print("Top 10 director frequency in appearence")
print(director_count.head(11))
```

```
Top 10 director frequency in appearence
      director  appearence
0   Unknown director    49358
1   Damien Chazelle      416
2   Laïla Marrakchi      416
3   Houda Benyamina      416
4       Alan Poul        416
5  Gautham Vasudev Menon   286
6   Priyadarshan         198
7       Sarjun           198
8  Rathindran R Prasad    198
9   Arvind Swamy         198
10  Karthik Subbaraj      198
```

```
In [167]: genre = df["listed_in"].str.split(", ").explode().str.strip()
genre
```

```
Out[167]: 0      Documentaries
1  International TV Shows
1      TV Dramas
1      TV Mysteries
1  International TV Shows
...
8806  International Movies
8806  Music & Musicals
8806      Dramas
8806  International Movies
8806  Music & Musicals
Name: listed_in, Length: 506879, dtype: object
```

```
In [168]: df1 = pd.read_csv("netflix.csv")
```

```
In [169]: df1['director'].fillna("Unknown director", inplace = True)
df1['cast'].fillna("Unknown cast", inplace = True)
df1['country'].fillna("Unknown country", inplace = True)
df1['date_added'].fillna("January 1, 1900", inplace = True)
df1['rating'].fillna("Unknown rating", inplace = True)
df1['duration'].fillna("Unknown duration", inplace = True)
missing_values = df1.isnull().sum()
print("\nMissing Values:")
print(missing_values)
df1["type"] = df1["type"].astype("category")
df1["country"] = df1["country"].astype("category")
df1["rating"] = df1["rating"].astype("category")
```

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

```
In [170]: df1['date_added'] = pd.to_datetime(df1['date_added'])

# Calculate the difference in days between 'date_added' and 'release_year'
df1['days_to_add'] = (df1['date_added'] - pd.to_datetime(df1['release_year'], format='%Y')).dt.days

# Calculate the mode (most common) value for 'days_to_add'
mode_days_to_add = df1['days_to_add'].mode().iloc[0]

print(f"The most common time duration between release and addition to Netflix is approximately {mode_days_to_add} days.")

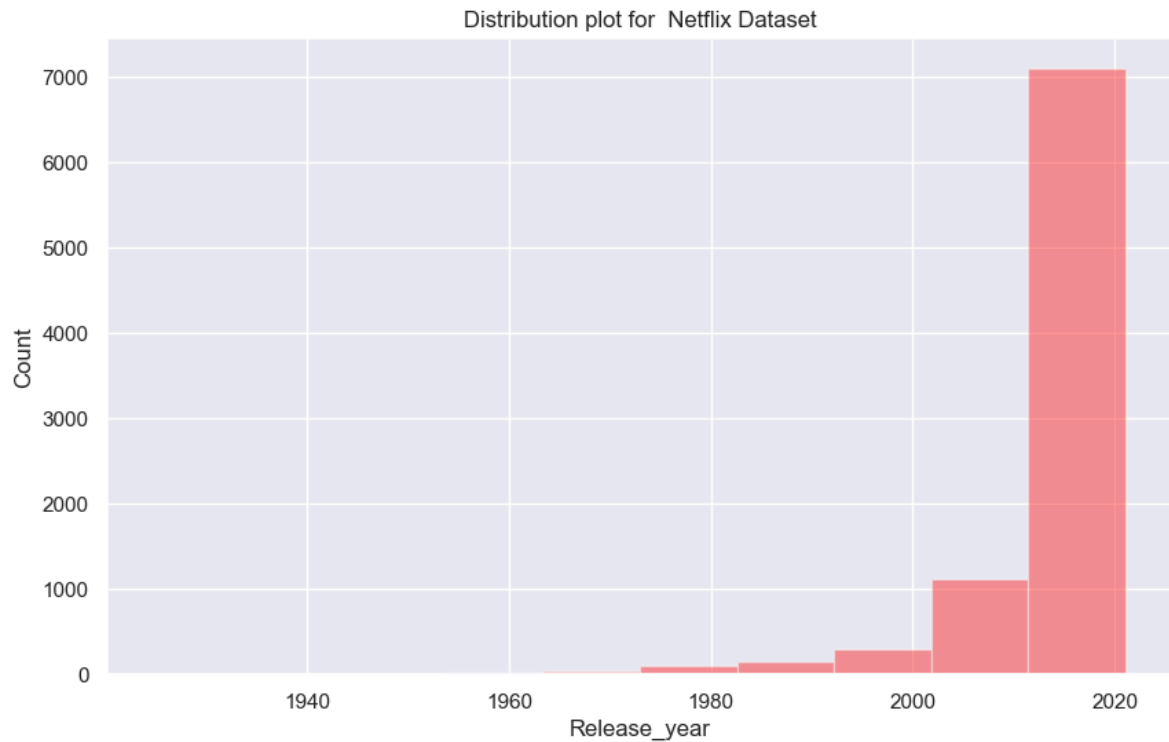
The most common time duration between release and addition to Netflix is approximately 334 days.
```



```
In [171]: # 1.For continuous variable(s): Distplot, countplot, histogram for univariate analysis

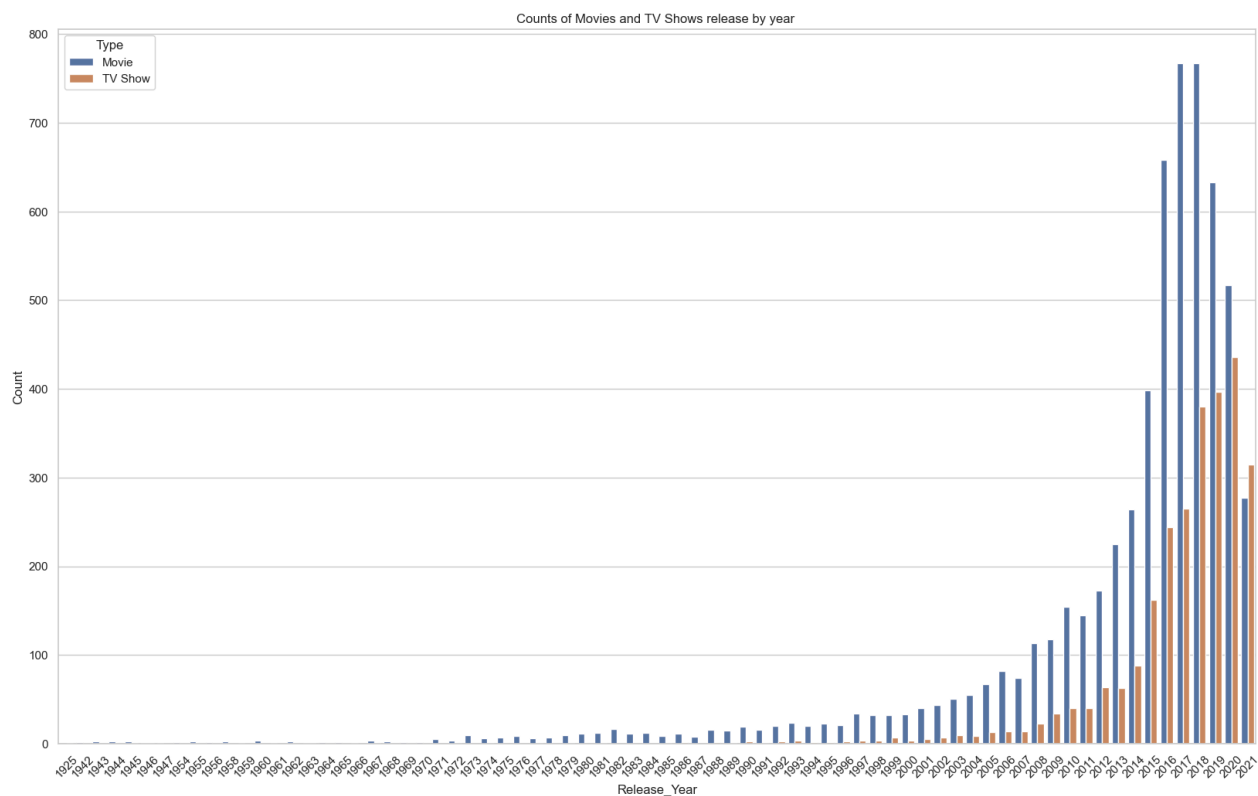
# Distplot for 'release_year'

# Create a distribution plot for rating
plt.figure(figsize=(10,6))
sns.set(style="darkgrid") #set the plot style
sns.distplot(df1['release_year'],bins=10,kde=False,color='red')
# add labels and a title
plt.xlabel('Release_year')
plt.ylabel('Count')
plt.title('Distribution plot for Netflix Dataset')
# show the plot
plt.show()
```

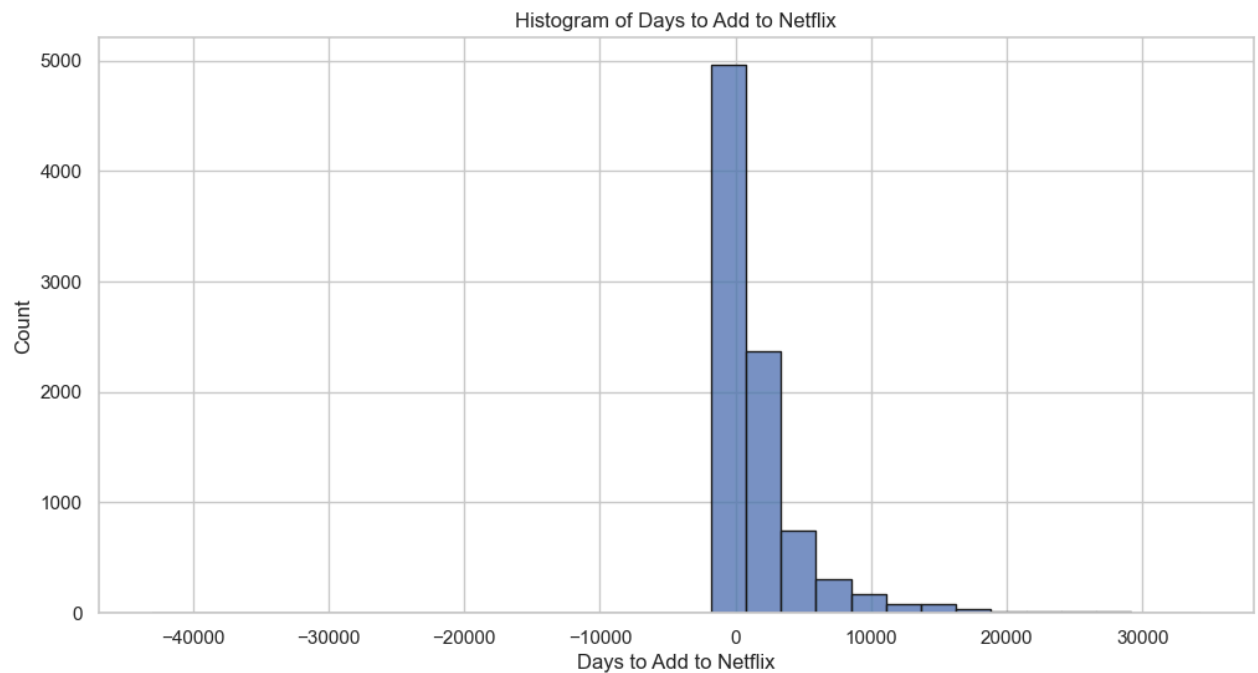


```
In [173]: # for countplot
```

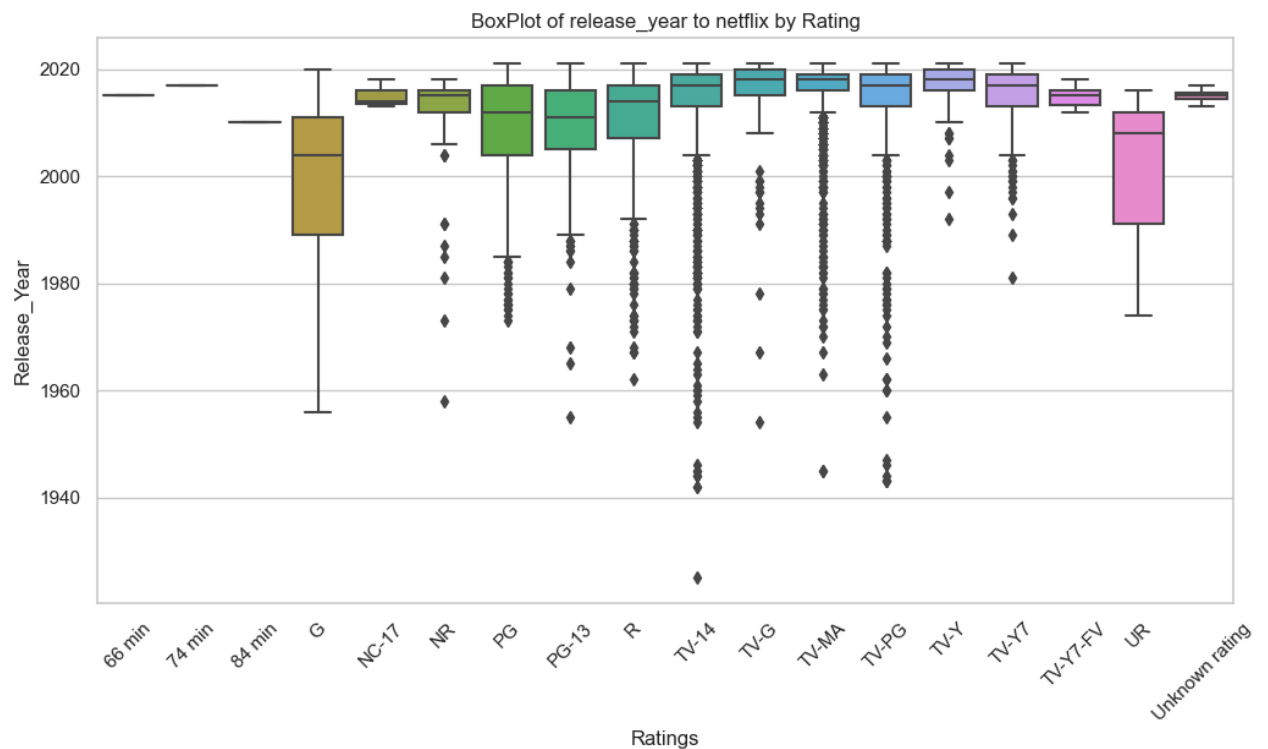
```
# Create a count plot for the "genre" column
sns.set(style="whitegrid") #set the style for the plot
plt.figure(figsize=(20,12)) #set the figure size
# Assuming 'Genre' is the name of the categorical variable
sns.countplot(data=small_df,x='release_year',hue='type')
# add label and a title
plt.xlabel('Release_Year')
plt.ylabel('Count')
plt.title('Counts of Movies and TV Shows release by year ')
plt.legend(title='Type',loc='upper left',labels=['Movie','TV Show'])
# Rotate x-axis labels for better readability
plt.xticks(rotation=45)
# show the plot
plt.show()
```



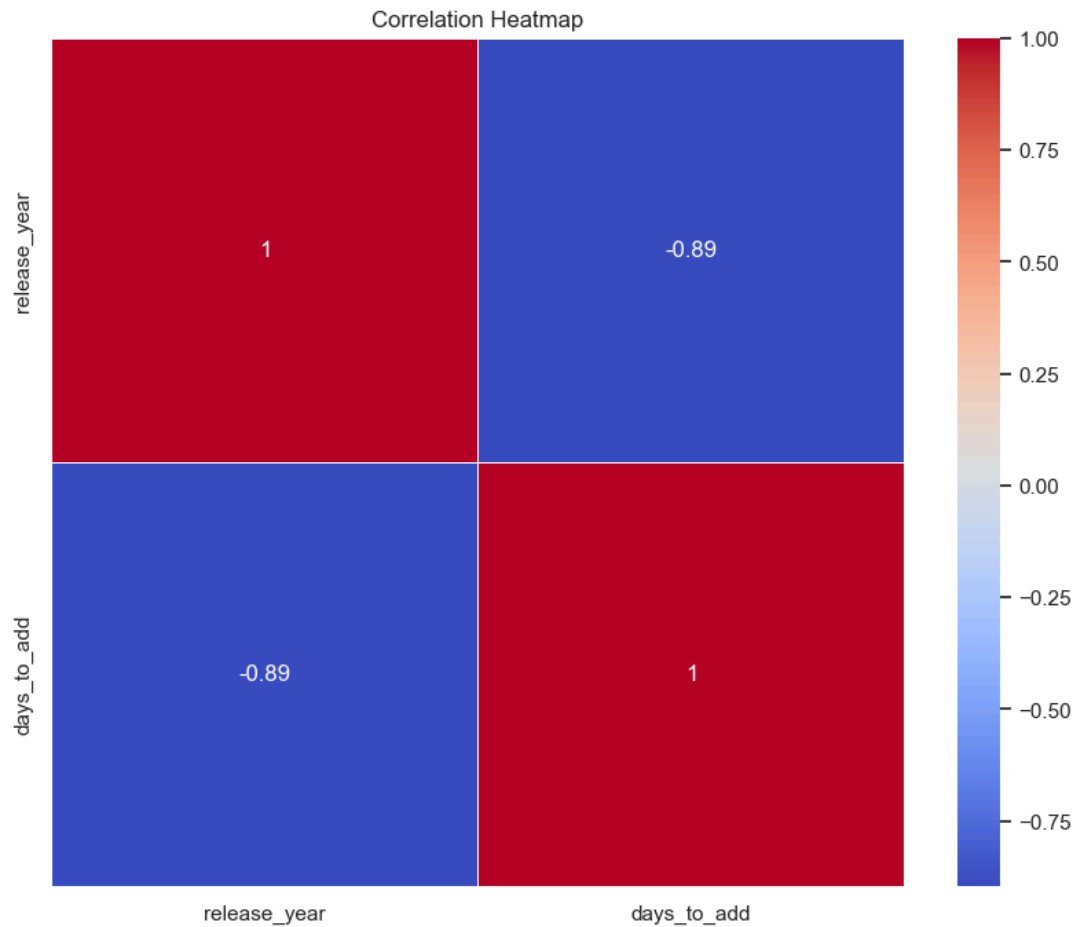
```
In [176]: # Histogram for days_to_add
plt.figure(figsize=(12, 6))
sns.histplot(df1['days_to_add'], bins=30, edgecolor='k')
plt.title('Histogram of Days to Add to Netflix')
plt.xlabel('Days to Add to Netflix')
plt.ylabel('Count')
plt.grid(True)
plt.show()
```



```
In [177]: # Boxplot for Categorical Variables
plt.figure(figsize=(12, 6))
sns.boxplot(data=df1, x='rating', y='release_year')
plt.title('BoxPlot of release_year to netflix by Rating')
plt.xlabel('Ratings')
plt.ylabel('Release_Year')
plt.xticks(rotation=45)
plt.show()
```

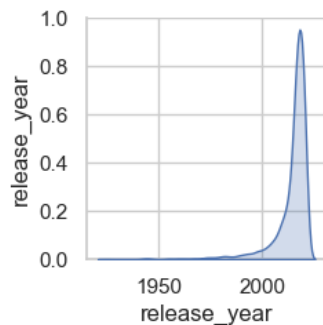


```
In [178]: # Correlation Analysis
# Calculate the correlation matrix
correlation_matrix=df1.corr()
# Heatmap to visualize the correlations
plt.figure(figsize=(10,8))
sns.heatmap(correlation_matrix,annot=True,cmap='coolwarm',linewidths=0.5)
plt.title('Correlation Heatmap')
plt.show()
```

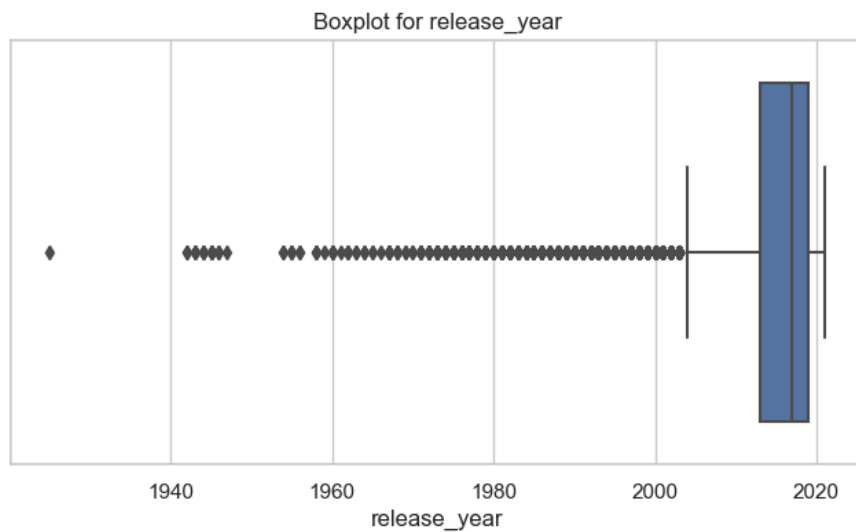


- Pair plot - It creates a grid of plots showing how each variable in the dataset relates to every other variable.
- Explore relationships between multiple numerical variables.
- Visualize distributions of individual variables.

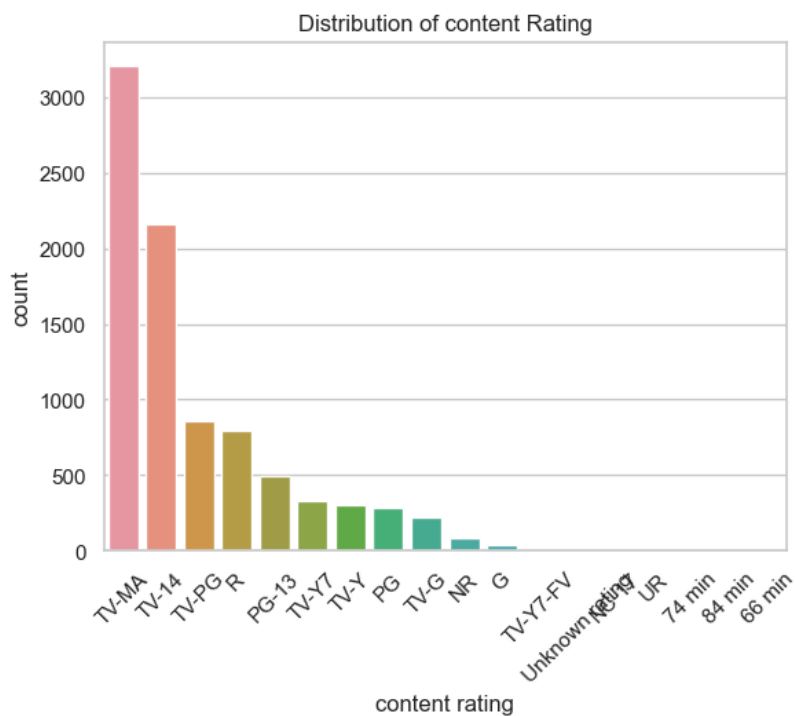
```
In [179]: # Pairplot for selected numeric columns
import seaborn as sns
numeric_cols=['release_year', 'date_added']
sns.pairplot(df1[numeric_cols],diag_kind='kde')
plt.show()
```



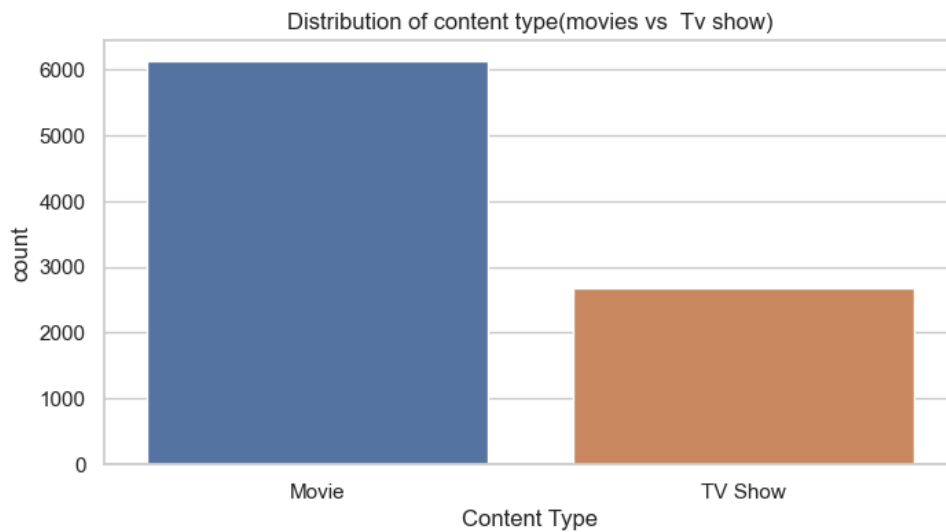
```
In [180]: # Check for Outlier
plt.figure(figsize=(8,4))
sns.boxplot(x='release_year',data=df1)
plt.title('Boxplot for release_year')
plt.show()
```



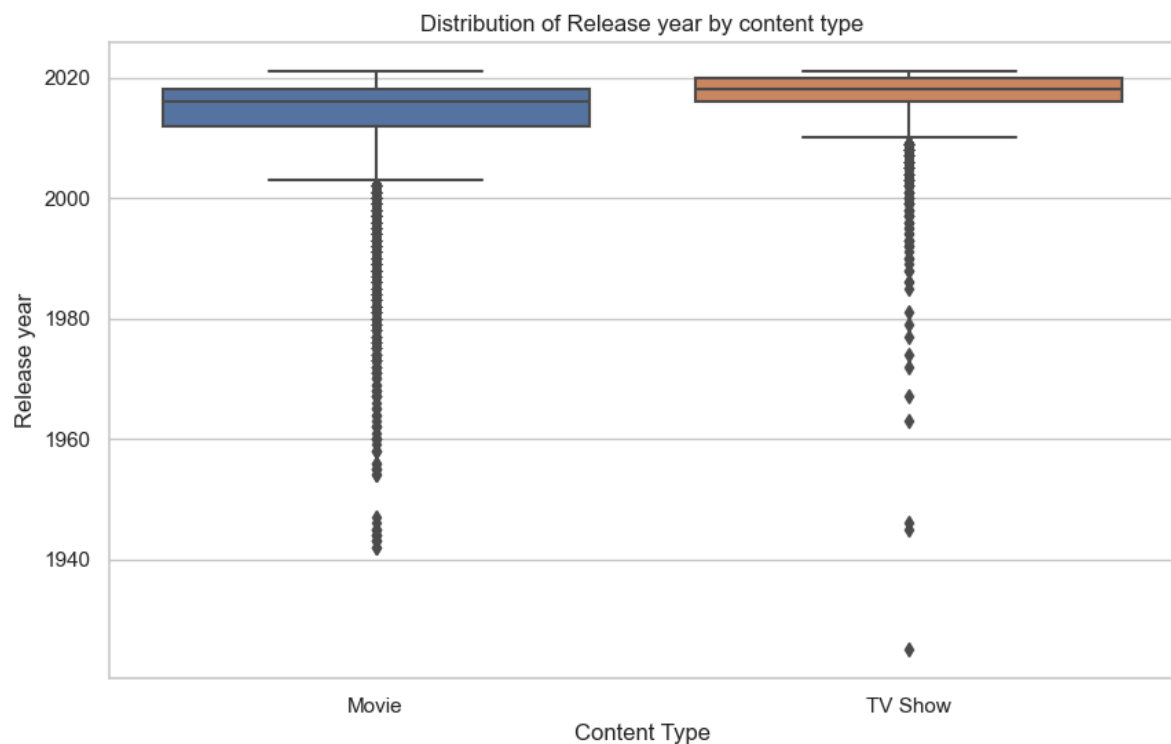
```
In [184]: sns.countplot(x='rating',data=df1,order=df1['rating'].value_counts().index)
plt.title('Distribution of content Rating')
plt.xlabel('content rating')
plt.ylabel('count')
plt.xticks(rotation=45)
plt.show()
```



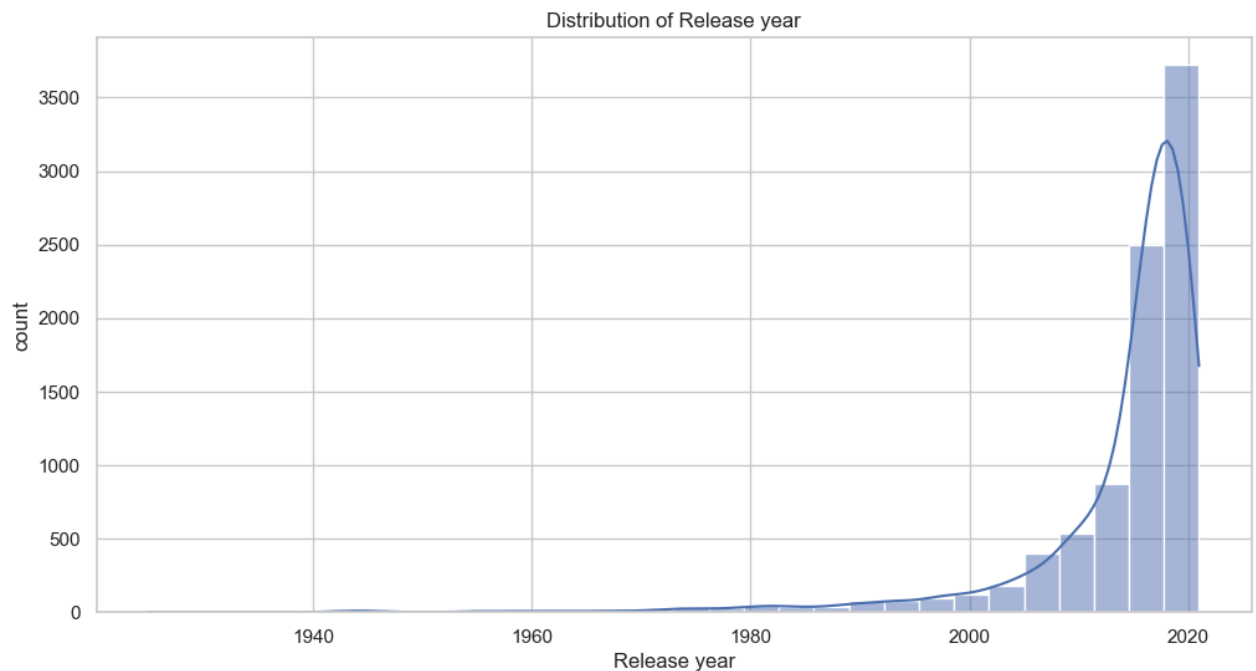
```
In [185]: # Distribution of Content Type(Movies vs show)
plt.figure(figsize=(8,4))
sns.countplot(x='type',data=df1)
plt.title('Distribution of content type(movies vs Tv show)')
plt.xlabel('Content Type')
plt.ylabel('count')
plt.show()
```



```
In [186]: # Content Type and release year
plt.figure(figsize=(10,6))
sns.boxplot(x='type',y='release_year',data=df1)
plt.title('Distribution of Release year by content type')
plt.xlabel('Content Type')
plt.ylabel('Release year')
plt.show()
```



```
In [187]: plt.figure(figsize=(12,6))
sns.histplot(x='release_year',bins=30,kde=True,data=df1)
plt.title('Distribution of Release year')
plt.xlabel('Release year')
plt.ylabel('count')
plt.show()
```



```
### <font color='purple'>6. Insights based on Non-Graphical and Visual Analysis </font>
- 1 Comments on the range of attributes

- 2 Comments on the distribution of the variables and relationship between them

- 3 Comments for each univariate and bivariate plot
```

```
In [189]: # Comments on the range of attributes date_added $ release_year
```

```
# For the date_added attributes:
# extract the minimum and maximum dates
min_date=df1['date_added'].min()
max_date=df1['date_added'].max()
```

```
In [190]: # Print the result
print('Minimum Date:',min_date)
print('Maximum Date:',max_date)
```

```
Minimum Date: 1900-01-01 00:00:00
Maximum Date: 2021-09-25 00:00:00
```

```
In [191]: # Find the minimum and maximum years
min_year=df1['release_year'].min()
max_year=df1['release_year'].max()
```

```
In [192]: # Print the results
print("Minimum year:", min_year)
print("Maximum year:", max_year)
```

```
Minimum year: 1925
Maximum year: 2021
```

```
In [193]: # 2 Comments on the distribution of the variables and relationship between them
```

```
In [194]: # for rating_distribution
ratings_distribution=df1['rating'].describe()
ratings_distribution
```

```
Out[194]: count      8807
unique        18
top           TV-MA
freq         3207
Name: rating, dtype: object
```

In [195]: `# For release_year distribution`

```
release_year_distribution=df1['release_year'].value_counts().sort_index()
release_year_distribution
```

```
Out[195]: 1925      1
          1942      2
          1943      3
          1944      3
          1945      4
          ...
          2017    1032
          2018    1147
          2019    1030
          2020     953
          2021     592
          Name: release_year, Length: 74, dtype: int64
```

In [204]: `df["country"].value_counts().sort_values(ascending = False).head(6)`

```
Out[204]: United States      42002
          India              21372
          Unknown country    11897
          Japan              7026
          United Kingdom     5353
          South Korea         4306
          Name: country, dtype: int64
```

In [214]: `df["Listed_split"] = df["listed_in"].str.split(", ")`

In [219]: `df["Listed_split"].explode().value_counts().head(7)`

```
Out[219]: Dramas              75504
          International Movies  75053
          Comedies             50256
          International TV Shows 35356
          Action & Adventure     28296
          Independent Movies     27096
          TV Dramas             23356
          Name: Listed_split, dtype: int64
```

7. Business Insights - Should include patterns observed in the data along with what you can infer from it

- 1. Netflix has two primary content types — Movies and TV Shows. Typically, Movies make up around 65–70% of the catalog, while TV Shows comprise the rest.
- 2. Most content has been added after 2015, especially a large spike around 2018–2021. The release year and date added don't always match — many shows were released earlier but added later.
- 3. Top contributing countries are United States, India, United Kingdom, Japan, and South Korea.
- 4. Top contributing countries are United States, India, United Kingdom, Japan, and South Korea.
- 5. Most titles fall under TV-MA, TV-14, and R ratings — indicating mature audiences dominate the platform.
- 6. Common genres include Dramas, International Movies, Comedies, International TV Shows.
- 7. Movies: Average runtime ~90 minutes, TV Shows: Most have 1–3 seasons.
- 8. The number of titles added increased sharply around 2019–2020, possibly due to global lockdowns.

8. Recommendations - Actionable items for business. No technical jargon. No complications. Simple action items that everyone can understand

- 1. Most titles are rated for adults. Introduce more PG and G-rated shows to attract families and children.
- 2. Invest in local language shows and movies from countries like India, Japan, and South Korea to grow regional subscriber bases.
- 3. Create short, quick-watch episodes or mini-movies to keep users engaged during breaks or commutes.
- 4. Documentaries are popular — continue producing more true-crime, nature, and social issue documentaries.
- 5. Collaborate with regional directors and production houses to bring diverse, authentic stories.
- 6. Ensure every show has director, cast, and country details for better recommendations and user trust.
- 7. Regularly review viewing data to understand changing audience interests and adjust the content plan accordingly.

In []: