netflix-data-analysis-and-visual

October 12, 2024

1 Netflix Data: Cleaning, Analysis and Visualization

2 Introduction:

```
[1]: # This project involves Netflix data cleaning, analysis, and visualization

using Python and SQL.

# We extracted insights by querying and organizing content based on attributes

such as type and country.

# Data analysis was performed to uncover trends, patterns, and key metrics in

Netflix's dataset.

# Python libraries like pandas, matplotlib, and seaborn were used for effective

data visualization.

# The project aimed to provide a comprehensive view of Netflix's content

distribution and statistics.
```

3 Importing Libraries:

4 Importing Dataset:

```
[3]: data = pd.read_csv("C:/Users/ASUS/Desktop/Power BI Practice/netflix1.csv") data.head(10)
```

```
[3]:
                                                   show_title
                                                                           director
       show_id show_type
                                        Dick Johnson Is Dead
     0
            s1
                    Movie
                                                                   Kirsten Johnson
     1
            s3
                 TV Show
                                                    Ganglands
                                                                    Julien Leclercq
     2
                 TV Show
                                               Midnight Mass
                                                                      Mike Flanagan
            s6
                           Confessions of an Invisible Girl
     3
           s14
                   Movie
                                                                      Bruno Garotti
     4
                                                      Sankofa
                                                                       Haile Gerima
            s8
                    Movie
     5
            s9
                 TV Show
                              The Great British Baking Show
                                                                    Andy Devonshire
     6
           s10
                    Movie
                                                The Starling
                                                                     Theodore Melfi
     7
          s939
                            Motu Patlu in the Game of Zones
                    Movie
                                                                        Suhas Kadav
     8
           s13
                    Movie
                                                Je Suis Karl
                                                               Christian Schwochow
     9
          s940
                                   Motu Patlu in Wonderland
                                                                        Suhas Kadav
                    Movie
                         date_added
                                     release_year rating
                                                             duration
                country
                          9/25/2021
                                                               90 min
     0
         United States
                                              2020
                                                    PG-13
     1
                France
                          9/24/2021
                                              2021
                                                    TV-MA
                                                             1 Season
     2
         United States
                          9/24/2021
                                              2021
                                                    TV-MA
                                                             1 Season
     3
                Brazil
                          9/22/2021
                                              2021
                                                    TV-PG
                                                               91 min
         United States
     4
                          9/24/2021
                                              1993
                                                    TV-MA
                                                              125 min
        United Kingdom
                          9/24/2021
                                              2021
                                                    TV-14
                                                            9 Seasons
     5
     6
         United States
                          9/24/2021
                                              2021
                                                   PG-13
                                                              104 min
     7
                  India
                        05-01-2021
                                              2019
                                                    TV-Y7
                                                               87 min
                          9/23/2021
                                              2021
                                                              127 min
     8
               Germany
                                                    TV-MA
     9
                  India
                        05-01-2021
                                              2013
                                                    TV-Y7
                                                               76 min
                                                   listed_in
     0
                                              Documentaries
        Crime TV Shows, International TV Shows, TV Act...
     1
     2
                        TV Dramas, TV Horror, TV Mysteries
     3
                        Children & Family Movies, Comedies
     4
         Dramas, Independent Movies, International Movies
     5
                              British TV Shows, Reality TV
     6
                                           Comedies, Dramas
     7
        Children & Family Movies, Comedies, Music & Mu...
                              Dramas, International Movies
     8
     9
               Children & Family Movies, Music & Musicals
```

5 About Dataset

[4]: data.info()

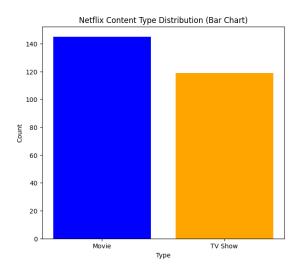
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 8790 entries, 0 to 8789
Data columns (total 10 columns):

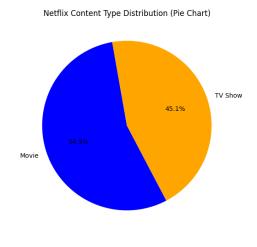
#	Column	Non-Null Count	Dtype
0	show_id	8790 non-null	object
1	show_type	8790 non-null	object

```
show_title
                 8790 non-null
                                 object
2
3
    director
                 8790 non-null object
4
    country
                 8790 non-null
                                object
5
    date_added
                 8790 non-null
                                 object
    release year 8790 non-null int64
                 8790 non-null object
7
    rating
                 8790 non-null object
8
    duration
    listed in
                 8790 non-null
                                 object
dtypes: int64(1), object(9)
memory usage: 686.8+ KB
```

6 Count the Number of Movies and TV Shows.

```
[5]: query = """SELECT show type, COUNT(*) AS count
     FROM netflix1
     GROUP BY Show type"""
     cur.execute(query)
     data = cur.fetchall()
     df = pd.DataFrame(data, columns = ["Type", "Count"])
     df
[5]:
           Type Count
         Movie
                   145
     0
     1 TV Show
                   119
[6]: fig, axes = plt.subplots(nrows=1, ncols=2, figsize=(15, 6))
     # Bar Chart
     colors = ['blue', 'orange',]
     axes[0].bar(df['Type'], df['Count'], color=colors)
     axes[0].set_xlabel('Type')
     axes[0].set_ylabel('Count')
     axes[0].set_title('Netflix Content Type Distribution (Bar Chart)')
     # Pie Chart
     colors = ['blue', 'orange'] # Customize colors as needed
     explode = (0.1, 0) # Explode the first slice
     axes[1].pie(df['Count'], labels=df['Type'], colors=colors, autopct='%1.1f\%',__
     ⇔startangle=100)
     axes[1].set_title('Netflix Content Type Distribution (Pie Chart)')
     plt.show()
```





7 Finding the Most Common Genre Combinations.

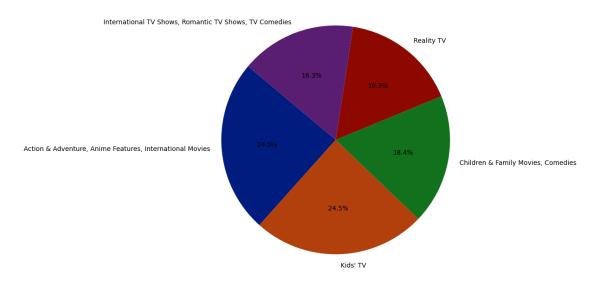
```
[7]: query = """SELECT listed_in, COUNT(*) AS genre_count
    FROM netflix1
    GROUP BY listed_in
    ORDER BY genre_count DESC
    LIMIT 5"""
    cur.execute(query)
    data = cur.fetchall()
    df = pd.DataFrame(data, columns = ["Categories", "Genre"])
    df
```

```
[7]:

Categories Genre
O Action & Adventure, Anime Features, Internatio... 12
1 Kids' TV 12
2 Children & Family Movies, Comedies 9
3 Reality TV 8
4 International TV Shows, Romantic TV Shows, TV ... 8
```

```
[8]: query = """SELECT listed_in, COUNT(*) AS genre_count
FROM netflix1
GROUP BY listed_in
ORDER BY genre_count DESC
LIMIT 5"""
cur.execute(query)
data = cur.fetchall()
df = pd.DataFrame(data, columns = ["Categories", "Genre"])
colors = sns.color_palette("dark", len(df)) # Choose a color palette
plt.figure(figsize=(8, 8))
```

Top 5 Genres by Title Count



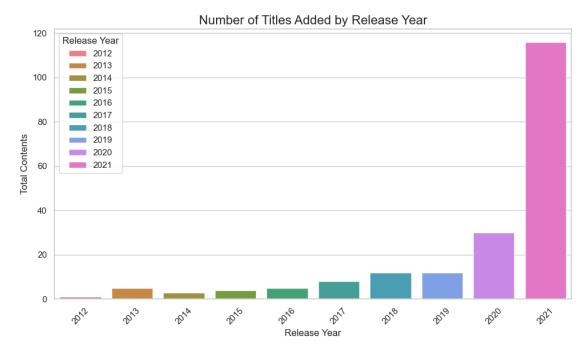
8 Top 10 years having most numbers of content.

```
[9]: query = """SELECT release_year, COUNT(*) AS titles_added
FROM netflix.netflix1
GROUP BY release_year
ORDER BY release_year DESC
LIMIT 10"""
cur.execute(query)
data = cur.fetchall()
df = pd.DataFrame(data, columns = ["Release Year", "Total Contents"])
df
```

```
[9]:
        Release Year Total Contents
     0
                2021
                                  116
     1
                2020
                                   30
     2
                2019
                                   12
     3
                2018
                                   12
     4
                2017
                                    8
     5
                2016
                                    5
     6
                2015
                                    4
                2014
                                    3
```

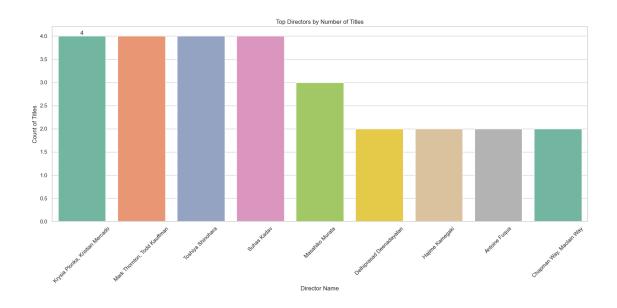
```
8 2013 5
9 2012 1
```

```
[10]: query = """SELECT release_year, COUNT(*) AS titles_added
      FROM netflix.netflix1
      GROUP BY release_year
      ORDER BY release_year DESC
      LIMIT 10"""
      cur.execute(query)
      data = cur.fetchall()
      df = pd.DataFrame(data, columns = ["Release Year", "Total Contents"])
      df = pd.DataFrame(data, columns=["Release Year", "Total Contents"])
      sns.set(style="whitegrid")
      palette = sns.color_palette("husl", len(df))
      plt.figure(figsize=(10, 6))
      bar_plot = sns.barplot(x="Release Year", y="Total Contents", hue='Release⊔
       →Year', data=df, palette=palette)
      plt.title("Number of Titles Added by Release Year", fontsize=16)
      plt.xlabel("Release Year", fontsize=12)
      plt.ylabel("Total Contents", fontsize=12)
      plt.xticks(rotation=45)
      plt.tight_layout()
      plt.show()
```



9 Finding the Top 10 Directors with the Most Titles.

```
[11]: query = """SELECT director, COUNT(*) AS title count
      FROM netflix1
      WHERE director IS NOT NULL
      GROUP BY director
      ORDER BY title_count DESC
      LIMIT 9 OFFSET 1"""
                                    # becouse top rank holds "Not Given"
      cur.execute(query)
      data = cur.fetchall()
      df = pd.DataFrame(data, columns = ["Director Name", "Count"])
      df
[11]:
                           Director Name Count
        Krysia Plonka, Kristian Mercado
      1
            Mark Thornton, Todd Kauffman
                                               4
      2
                       Toshiya Shinohara
                                               4
      3
                             Suhas Kadav
                                               4
      4
                         Masahiko Murata
                                               3
                                               2
      5
                Delhiprasad Deenadayalan
                         Hajime Kamegaki
                                               2
      6
      7
                           Antoine Fugua
                                               2
                                               2
                Chapman Way, Maclain Way
[12]: query = """SELECT director, COUNT(*) AS title_count
      FROM netflix1
      WHERE director IS NOT NULL
      GROUP BY director
      ORDER BY title count DESC
      LIMIT 9 OFFSET 1"""
      cur.execute(query)
      data = cur.fetchall()
      df = pd.DataFrame(data, columns=["Director Name", "Count"])
      df = df.sort_values(by="Count", ascending=False)
      color_palette = sns.color_palette("Set2", len(df))
      plt.figure(figsize=(16, 8))
      ax = sns.barplot(x="Director Name", y="Count", data=df, palette=color_palette,__
       ⇔hue="Director Name", dodge=False, legend=False)
      ax.bar label(ax.containers[0])
      plt.xticks(rotation=45)
      plt.title("Top Directors by Number of Titles")
      plt.xlabel("Director Name")
      plt.ylabel("Count of Titles")
      plt.tight_layout()
      plt.show()
```



10 Geting the Longest Movies in Terms of Duration.

```
[13]: query = """SELECT show_title, duration
FROM netflix1
WHERE show_type = 'Movie'
ORDER BY CAST(SUBSTRING_INDEX(duration, ' ', 1) AS UNSIGNED) DESC
LIMIT 10"""
cur.execute(query)
data = cur.fetchall()
df = pd.DataFrame(data, columns = ["Titles","Duration"])
df
```

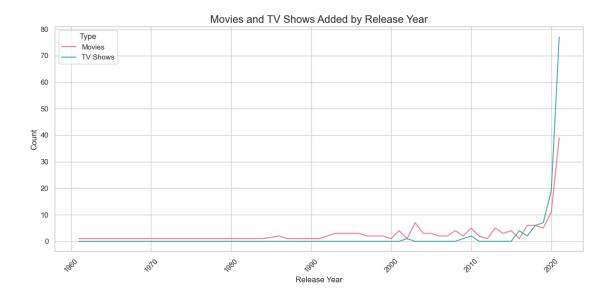
```
[13]:
                             Titles Duration
        Headspace: Unwind Your Mind 273 min
        Once Upon a Time in America 229 min
      2
                       King of Boys 182 min
      3
                              Jeans 166 min
      4
                    Avvai Shanmughi 161 min
               The Guns of Navarone 156 min
      5
      6
                      Cold Mountain 154 min
      7
                     Minsara Kanavu 147 min
      8
               Omo Ghetto: the Saga 147 min
      9
            Tughlaq Durbar (Telugu) 145 min
```

11 Getting Yearly releases of Movies and TV Shows on Netflix.

[14]:		Movies	TV	Shows	Release	Year
	0	1		0		1961
	1	1		0		1975
	2	1		0		1978
	3	1		0		1980
	4	1		0		1982
	5	1		0		1983
	6	1		0		1984
	7	2		0		1986
	8	1		0		1987
	9	1		0		1989
	10	1		0		1990
	11	1		0		1991
	12	3		0		1993
	13	3		0		1994
	14	3		0		1996
	15	2		0		1997
	16	2		0		1998
	17	2		0		1999
	18	1		0		2000
	19	4		0		2001
	20	1		1		2002
	21	7		0		2003
	22	3		0		2004
	23	3		0		2005
	24	2		0		2006
	25	2		0		2007
	26	4		0		2008
	27	2		1		2009
	28	5		2		2010
	29	2		0		2011
	30	1		0		2012
	31	5		0		2013

```
32
          3
                     0
                                 2014
33
          4
                     0
                                 2015
34
          1
                     4
                                 2016
                     2
35
          6
                                 2017
36
          6
                     6
                                 2018
          5
                     7
                                 2019
37
38
        11
                    19
                                 2020
39
         39
                    77
                                 2021
```

```
[15]: query = """SELECT
        COUNT(CASE WHEN show_type = 'Movie' THEN 1 END) AS movie_count,
        COUNT(CASE WHEN show_type = 'TV Show' THEN 1 END) AS tv_show_count,
        release year
      FROM netflix.netflix1
      GROUP BY release year
      ORDER BY release_year"""
      cur.execute(query)
      data = cur.fetchall()
      df = pd.DataFrame(data, columns = ["Movies","TV Shows","Release Year"])
      sns.set(style="whitegrid")
      palette = sns.color_palette("husl", 2)
      plt.figure(figsize=(12, 6))
      sns.lineplot(data=df, x="Release Year", y="Movies", label="Movies", L
       ⇔color=palette[0])
      sns.lineplot(data=df, x="Release Year", y="TV Shows", label="TV Shows", L
       ⇔color=palette[1])
      plt.title("Movies and TV Shows Added by Release Year", fontsize=16)
      plt.xlabel("Release Year", fontsize=12)
      plt.ylabel("Count", fontsize=12)
      plt.legend(title='Type')
      plt.xticks(rotation=45)
      plt.tight_layout()
      plt.show()
```



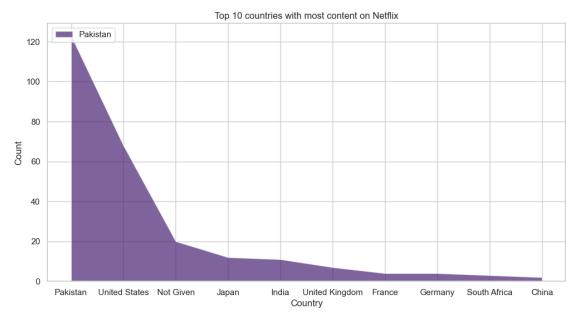
12 Top 10 countries with most content on Netflix.

```
[16]: query = """SELECT country, COUNT(*) AS count
FROM netflix1
WHERE country IS NOT NULL
GROUP BY country
ORDER BY count DESC
LIMIT 10"""
cur.execute(query)
data = cur.fetchall()
df = pd.DataFrame(data, columns = ["Country", "Count"])
df
```

```
[16]:
                 Country Count
                Pakistan
      0
                             123
      1
          United States
                              68
               Not Given
                              20
      2
      3
                   Japan
                              12
      4
                   India
                              11
                               7
        United Kingdom
      5
      6
                  France
                               4
      7
                 Germany
                               4
      8
           South Africa
                               3
                   China
                               2
      9
```

```
[17]: query = """SELECT country, COUNT(*) AS count
FROM netflix1
WHERE country IS NOT NULL
```

```
GROUP BY country
ORDER BY count DESC
LIMIT 10"""
cur.execute(query)
data = cur.fetchall()
df = pd.DataFrame(data, columns = ["Country", "Count"])
colors = sns.color_palette("viridis", len(df)) # Choose a color palette
# Create the area chart
plt.figure(figsize=(12, 6))
plt.stackplot(df['Country'], df['Count'], labels=df['Country'], colors=colors,
 ⇒alpha=0.7)
plt.xlabel('Country')
plt.ylabel('Count')
plt.title('Top 10 countries with most content on Netflix')
plt.legend(loc='upper left')
plt.show()
```



13 Calculating the Average Duration of Movies by Country.

```
[18]: query = """SELECT country, round(AVG(CAST(SUBSTRING_INDEX(duration, ' ', 1) AS<sub>□</sub>

SUNSIGNED)),0) AS avg_duration

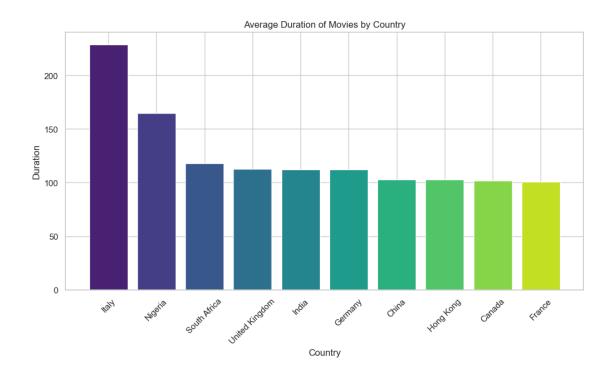
FROM netflix1

WHERE show_type = 'Movie' AND country IS NOT NULL

GROUP BY country

ORDER BY avg_duration DESC
```

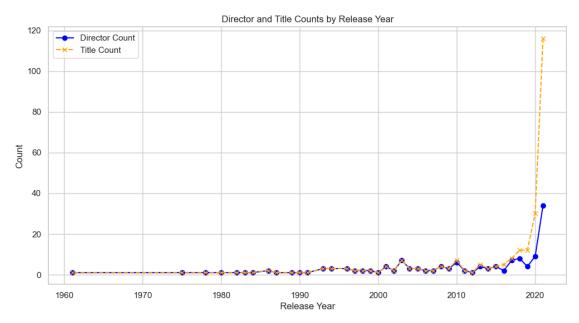
```
LIMIT 10"""
      cur.execute(query)
      data = cur.fetchall()
      df = pd.DataFrame(data, columns = ["Country", "Duration"])
[18]:
                Country Duration
      0
                  Italy
                             229
      1
                Nigeria
                             165
      2
           South Africa
                             118
      3 United Kingdom
                             113
      4
                  India
                             112
      5
                Germany
                             112
                  China
                             103
      6
      7
              Hong Kong
                             103
                 Canada
                             102
      8
      9
                 France
                             101
[19]: | query = """SELECT country, round(AVG(CAST(SUBSTRING_INDEX(duration, ' ', 1) AS_
       →UNSIGNED)),0) AS avg_duration
      FROM netflix1
      WHERE show_type = 'Movie' AND country IS NOT NULL
      GROUP BY country
      ORDER BY avg_duration DESC
      LIMIT 10"""
      cur.execute(query)
      data = cur.fetchall()
      df = pd.DataFrame(data, columns = ["Country", "Duration"])
      colors = sns.color_palette("viridis", len(df))
      plt.figure(figsize=(12, 6))
      plt.bar(df['Country'], df['Duration'], color=colors)
      plt.xlabel('Country')
      plt.ylabel('Duration')
      plt.title('Average Duration of Movies by Country')
      plt.xticks(rotation=45)
      plt.show()
```



14 Listing Titles Released Each Year with Their Count of Directors.

[20]:	Release Year	Director Count	Title Count
0	2021	34	116
1	2020	9	30
2	2019	4	12
3	2018	8	12
4	2017	7	8
5	2016	2	5
6	2015	4	4

```
7
              2014
                                   3
                                                   3
8
              2013
                                   4
                                                   5
9
              2012
                                   1
                                                   1
                                   2
                                                   2
10
              2011
11
              2010
                                   6
                                                   7
12
             2009
                                   3
                                                   3
13
             2008
                                   4
                                                   4
14
                                   2
                                                   2
             2007
                                   2
                                                   2
15
             2006
16
             2005
                                   3
                                                   3
17
                                   3
                                                   3
              2004
18
             2003
                                   7
                                                   7
19
              2002
                                   2
                                                   2
20
                                   4
             2001
                                                   4
21
             2000
                                   1
                                                   1
22
                                   2
                                                   2
              1999
                                   2
                                                   2
23
              1998
                                   2
24
              1997
                                                   2
                                   3
                                                   3
25
              1996
                                   3
26
              1994
                                                   3
27
              1993
                                   3
                                                   3
28
              1991
                                   1
                                                   1
29
              1990
                                   1
                                                   1
30
              1989
                                   1
                                                   1
31
              1987
                                   1
                                                   1
                                   2
32
              1986
                                                   2
33
              1984
                                   1
                                                   1
34
             1983
                                   1
                                                   1
35
              1982
                                   1
                                                   1
36
              1980
                                   1
                                                   1
37
              1978
                                   1
                                                   1
38
              1975
                                   1
                                                   1
39
                                   1
                                                   1
              1961
```

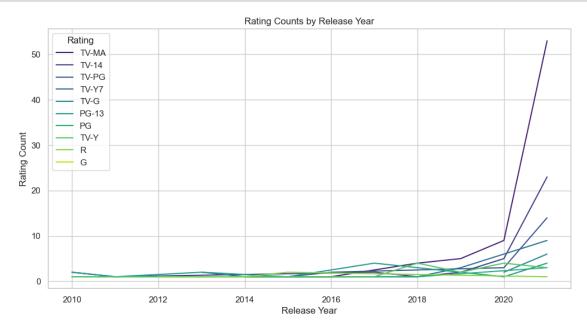


15 Identifying the Rating Distribution Over Time.

```
[22]: Release Year Rating Rating Count
0 2021 TV-MA 53
1 2021 TV-14 23
2 2021 TV-PG 14
```

2021	TV-Y7	9
2021	TV-G	6
	PG-13	4
	PG	3
	TV-Y	3
	R	1
	TV-MA	9
	TV-Y7	6
		5
	TV-Y	4
		3
		2
		1
		5
		3
		2
		2
		4
		4
		1
	PG	1
	G	1
		1
		4
		2
		1
		1
		2
		1
		1
		1
		2
		1
		1
		1
	TV-Y7	1
	R	1
	PG-13	2
	TV-Y7	2
		1
		1
		1
		1
		2
		2
		1
2010	PG	1
		2021 TV-G 2021 PG-13 2021 TV-Y 2021 TV-Y 2021 TV-MA 2020 TV-14 2020 TV-PG 2020 TV-G 2020 TV-G 2020 PG-13 2019 TV-Y 2019 TV-Y 2019 TV-Y 2018 TV-Y 2018 TV-MA 2018 TV-Y 2018 TV-Y 2018 TV-Y 2017 TV-14 2017 TV-14 2017 TV-Y 2016 TV-Y 2016 TV-Y 2016 TV-Y 2016 TV-Y 2015 R 2015 PG-13 2014 TV-MA 2015 PG-13 2014 TV-Y 2015 R 2015 PG-13 2014 TV-Y 2015 PG-13 20

```
[23]: | query = """SELECT release_year, rating, COUNT(*) AS rating_count
      FROM netflix1
      WHERE rating IS NOT NULL
      GROUP BY release_year, rating
      ORDER BY release year DESC, rating_count DESC
      LIMIT 50"""
      cur.execute(query)
      data = cur.fetchall()
      df = pd.DataFrame(data, columns = ["Release Year", "Rating", "Rating Count"])
      color_palette = sns.color_palette("viridis", len(df['Rating'].unique()))
      plt.figure(figsize=(12, 6))
      sns.lineplot(x='Release Year', y='Rating Count', hue='Rating', data=df,_
       →palette=color_palette)
      plt.xlabel('Release Year')
      plt.ylabel('Rating Count')
      plt.title('Rating Counts by Release Year')
      plt.legend(title='Rating')
      plt.grid(True)
      plt.show()
```



16 Average Duration of Movies by Rating.

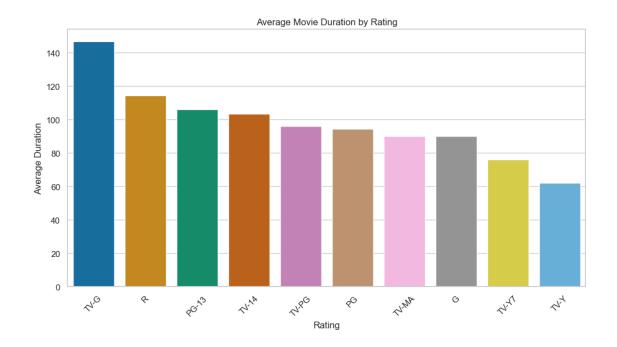
```
[24]: query = """SELECT rating, AVG(CAST(SUBSTRING_INDEX(duration, ' ', 1) AS

UNSIGNED)) AS average_duration

FROM netflix1

WHERE show_type = 'Movie' AND duration IS NOT NULL
```

```
GROUP BY rating
      ORDER BY average_duration DESC"""
      cur.execute(query)
      data = cur.fetchall()
      df = pd.DataFrame(data, columns = ["Rating", "Avrage Duration"])
      df
[24]: Rating Avrage Duration
     O TV-G
                     146.6667
      1
            R
                     114.5909
      2 PG-13
                     106.2143
      3 TV-14
                    103.4091
      4 TV-PG
                      96.0000
                     94.6429
     5
           PG
      6 TV-MA
                     90.1481
     7
           G
                      90.0000
     8 TV-Y7
                      76.2500
      9 TV-Y
                      62.2000
[25]: | query = """SELECT rating, AVG(CAST(SUBSTRING_INDEX(duration, ' ', 1) AS__
      →UNSIGNED)) AS average_duration
      FROM netflix1
      WHERE show_type = 'Movie' AND duration IS NOT NULL
      GROUP BY rating
      ORDER BY average_duration DESC"""
      cur.execute(query)
      data = cur.fetchall()
      df = pd.DataFrame(data, columns = ["Rating", "Avrage Duration"])
      colors = sns.color_palette("colorblind", len(df))
      plt.figure(figsize=(12, 6))
      sns.barplot(x="Rating", y="Avrage Duration", hue='Rating', data=df,__
      →palette=colors)
      plt.xlabel("Rating")
      plt.ylabel("Average Duration")
      plt.title("Average Movie Duration by Rating")
      plt.xticks(rotation=45)
      plt.show()
```



17 Analysis of Content Distribution by Country and Rating.

```
[26]: query = """SELECT
          country,
          COUNT(*) AS total_titles,
          MAX(rating) AS most_common_rating,
          round(AVG(release_year),0) AS avg_release_year
      FROM
          netflix1
      WHERE
          country IS NOT NULL AND rating IS NOT NULL AND release_year IS NOT NULL
      GROUP BY
          country
      ORDER BY
          total_titles DESC"""
      cur.execute(query)
      data = cur.fetchall()
      df = pd.DataFrame(data, columns = ["Countries", "Total Titles", "Most Commanu
       →Rating", "Average Release Year"])
      df
```

```
[26]:
               Countries Total Titles Most Comman Rating Average Release Year
      0
                Pakistan
                                    123
                                                      TV-Y7
                                                                              2020
                                                                              2007
      1
           United States
                                     68
                                                       TV-Y
      2
               Not Given
                                     20
                                                      TV-Y7
                                                                              2019
```

3	Japan	12	TV-PG	2006
4	India	11	TV-Y7	2011
5	United Kingdom	7	TV-14	2003
6	France	4	TV-MA	2017
7	Germany	4	TV-MA	2014
8	South Africa	3	TV-MA	2016
9	China	2	TV-14	2011
10	Nigeria	2	TV-MA	2019
11	Brazil	1	TV-PG	2021
12	Spain	1	TV-MA	2019
13	Philippines	1	TV-MA	2020
14	Australia	1	PG	2001
15	Argentina	1	TV-MA	2014
16	Canada	1	TV-14	2018
17	Hong Kong	1	TV-MA	2010
18	Italy	1	R	1984

18 SUMMARY

```
[27]: query = """SELECT
          show_type AS content_type,
          COUNT(*) AS total_titles,
          AVG(CASE WHEN show_type = 'Movie' AND duration IS NOT NULL THEN_
       \hookrightarrow CAST(SUBSTRING_INDEX(duration, ' ', 1) AS UNSIGNED) ELSE NULL END) AS_{\sqcup}
       →avg_duration,
          MIN(release_year) AS earliest_release_year,
          MAX(release_year) AS latest_release_year
      FROM netflix1
      WHERE show_type IS NOT NULL
      GROUP BY show_type"""
      cur.execute(query)
      data = cur.fetchall()
      df = pd.DataFrame(data, columns = ["Content", "Total Titles", "Average∟
       ⇔Duration", "Earliest Year Release", "Latest Release Year"])
      df
```

```
[27]: Content Total Titles Average Duration Earliest Year Release \
0 Movie 145 99.4483 1961
1 TV Show 119 None 2002

Latest Release Year
0 2021
1 2021
```

19 Conclusion

- [28]: # Data Cleaning: Efficiently handled missing values and removed duplicates for ⇔accurate analysis. # SQL Queries: Extracted key insights by summarizing content type, country, and ⇔release patterns. # Python Analysis: Applied pandas, matplotlib, and seaborn for comprehensive ⇔data exploration and visualization. # Content Trends: Identified top genres, countries, and patterns in content ⊔ \hookrightarrow type distribution. # Viewer Preferences: Analyzed relationships between release years and \sqcup ⇔popularity to uncover trends. # Insightful Visuals: Created engaging charts, graphs, and heatmaps to \Box ⇔communicate findings clearly. # Impactful Results: Delivered actionable insights to enhance strategic_ ⇔decision-making for content production. # $Effective\ Workflow:\ Demonstrated\ proficiency\ in\ data\ cleaning,\ SQL\ querying,$ →and Python visualization.
 - 20 Presented By Kumar Siddharth.
 - 21 Thank You.