# Brian\_Reppeto\_DSC550\_Week\_2

March 24, 2024

## 0.0.1 DSC 550 Week:

#### Activity 2.1

```
Author: Brian Reppeto 3/19/2024
[101]: # import libraries
       import pandas as pd
       import matplotlib.pyplot as plt
       import numpy as np
[102]: # load the csv file
       net = pd.read_csv('netflix_titles.csv')
[103]: # df shape
       net.shape
[103]: (8807, 12)
[104]: # sort the df
       net.sort_values(by=['release_year'])
                                                                       title
[104]:
            show_id
                        type
       4250
              s4251
                     TV Show
                                           Pioneers: First Women Filmmakers*
       7790
              s7791
                       Movie
                                                              Prelude to War
              s8206
                       Movie
                                                        The Battle of Midway
       8205
                       Movie Undercover: How to Operate Behind Enemy Lines
       8660
              s8661
       8739
              s8740
                       Movie
                                          Why We Fight: The Battle of Russia
       862
               s863 TV Show
                                                                     Special
       861
               s862
                       Movie
                                         Little Singham Future mein Satakli
       857
               s858
                     TV Show
                                                                The Neighbor
       876
                     TV Show
                                                                Alma Matters
               s877
                                                                      Yasuke
       965
               s966 TV Show
```

```
director \
4250
                                NaN
7790
                       Frank Capra
8205
                         John Ford
8660
                         John Ford
8739
      Frank Capra, Anatole Litvak
862
                                NaN
861
                     Prakash Satam
857
                                NaN
876
                                NaN
965
                                NaN
                                                                   country
                                                      cast
4250
                                                                       NaN
                                                       NaN
7790
                                                       NaN
                                                             United States
8205
                                Henry Fonda, Jane Darwell
                                                             United States
8660
                                                       NaN
                                                             United States
8739
                                                       NaN
                                                             United States
862
      Ryan O'Connell, Jessica Hecht, Punam Patel, Ma...
                                                         United States
861
      Anamaya Verma, Ganesh Divekar, Jigna Bharadhwa...
                                                                     NaN
857
      Quim Gutiérrez, Clara Lago, Adrián Pino, Catel...
                                                                   Spain
876
                                                                     India
965
      LaKeith Stanfield, Takehiro Hira, Maya Tanida,...
                                                                     NaN
             date_added
                          release_year rating
                                                  duration
4250
      December 30, 2018
                                                  1 Season
                                   1925
                                         TV-14
7790
         March 31, 2017
                                   1942
                                         TV-14
                                                    52 min
8205
         March 31, 2017
                                   1942
                                         TV-14
                                                    18 min
8660
         March 31, 2017
                                   1943
                                         TV-PG
                                                    61 min
8739
         March 31, 2017
                                   1943
                                         TV-PG
                                                    82 min
862
           May 20, 2021
                                   2021
                                         TV-MA
                                                 2 Seasons
861
           May 20, 2021
                                   2021
                                         TV-Y7
                                                    47 min
857
           May 21, 2021
                                   2021
                                         TV-MA
                                                 2 Seasons
876
           May 14, 2021
                                         TV-MA
                                                  1 Season
                                   2021
965
         April 29, 2021
                                         TV-MA
                                                  1 Season
                                   2021
                                                 listed in
4250
                                                  TV Shows
7790
                           Classic Movies, Documentaries
8205
                           Classic Movies, Documentaries
8660
                           Classic Movies, Documentaries
8739
                                             Documentaries
862
                                               TV Comedies
```

```
857
             International TV Shows, Spanish-Language TV Sh...
       876
                             Docuseries, International TV Shows
       965
                           Anime Series, International TV Shows
                                                     description
       4250
             This collection restores films from women who ...
       7790 Frank Capra's documentary chronicles the rise ...
             Director John Ford captures combat footage of ...
       8205
       8660
             This World War II-era training film dramatizes...
       8739
             This installment of Frank Capra's acclaimed do...
       862
             A young gay man with cerebral palsy branches o...
       861
             Little Singham and his crew travel to the year...
       857
             Self-centered Javier's life gets a bit messy w...
       876
             Alumni of India's elite academic institutes sh...
       965
             A peaceful boatman once known as the Black Sam...
       [8807 rows x 12 columns]
[105]: # tail the df
       net.tail(5)
[105]:
            show_id
                         type
                                     title
                                                    director \
              s8803
                       Movie
                                    Zodiac
                                              David Fincher
       8802
       8803
              s8804
                     TV Show Zombie Dumb
       8804
              s8805
                       Movie
                                Zombieland
                                           Ruben Fleischer
       8805
              s8806
                       Movie
                                      Zoom
                                               Peter Hewitt
       8806
              s8807
                       Movie
                                    Zubaan
                                                Mozez Singh
                                                                         country \
                                                            cast
       8802
             Mark Ruffalo, Jake Gyllenhaal, Robert Downey J... United States
       8803
                                                             NaN
                                                                             NaN
             Jesse Eisenberg, Woody Harrelson, Emma Stone, ... United States
       8804
             Tim Allen, Courteney Cox, Chevy Chase, Kate Ma... United States
       8805
       8806 Vicky Kaushal, Sarah-Jane Dias, Raaghav Chanan...
                                                                         India
                    date_added
                                release_year rating
                                                        duration
       8802
             November 20, 2019
                                         2007
                                                    R
                                                         158 min
       8803
                  July 1, 2019
                                                       2 Seasons
                                         2018
                                               TV-Y7
       8804
              November 1, 2019
                                                          88 min
                                         2009
                                                    R
       8805
              January 11, 2020
                                         2006
                                                   PG
                                                          88 min
       8806
                 March 2, 2019
                                                         111 min
                                         2015
                                              TV-14
                                                    listed_in \
                              Cult Movies, Dramas, Thrillers
       8802
```

Children & Family Movies, Comedies

861

8803	Kids' TV, Korean TV Shows, TV Comedies
8804	Comedies, Horror Movies
8805	Children & Family Movies, Comedies
8806	Dramas, International Movies, Music & Musicals
	description
8802	A political cartoonist, a crime reporter and a
8803	While living alone in a spooky town, a young g
8804	Looking to survive in a world taken over by zo
8805	Dragged from civilian life, a former superhero
8806	A scrappy but poor boy worms his way into a ty

## 0.0.2 Introduction explaining the data set

The dataset I choose is from Kaggle and is titled "Netflix Titles". The dataset is a comprehensive collection of movies and TV shows available on Netflix, with relaese dates between 1925 and 2021. The dataset has 8807 rows of data and 12 columns. The following is list of the columns.

show\_id: A unique identifier for each title.

type: The category of the title, indicating whether it is a movie or a TV show.

title: The name of the movie or TV show.

director: The director(s) of the movie or TV show. This field may be blank for some TV shows where a single director is not attributed.

cast: A list of main actors/actresses involved in the title. This field may also be blank, indicating that the cast information is either not available or not applicable.

country: The country or countries where the movie or TV show was produced. It can contain multiple countries separated by commas.

date\_added: The date on which the title was added to Netflix. This can vary across different countries but represents a general availability date.

release year: The year in which the movie or TV show was originally released.

rating: The rating given to the title, indicating the appropriate audience age group based on content.

duration: The length of the movie in minutes or the number of seasons for TV shows.

listed\_in: The genre(s) or category(ies) the title belongs to.

description: A brief description of the plot or premise of the title.

```
[106]: # the number NaN entries in each column
nan_entries_per_column=net.isnull().sum()
nan_entries_per_column # display
```

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

3

4

5

s4

s5

s6

TV Show

TV Show

TV Show

## 0.0.3 Question to explore

- 1. Content Growth Over Time: How has the number of titles (movies vs. TV shows) on Netflix changed over the years (looking at date added)
- 2. Release Patterns: Is there a trend in the release years of movies and TV shows.
- 3. Ratings Analysis: What ratings (e.g., PG, TV-MA) are most common among Netflix titles, and what does this suggest about the platform's target audience?

#### 0.0.4 Create at least three graphs that help answer these questions.

Make sure your graphs are clearly readable and are labeled appropriately and professionally

```
[107]: # Graph 1 fix data
       # convert 'date added' to string type to ensure we can apply string methods
       net['date_added'] = pd.to_datetime(net['date_added'], errors='coerce')
       # extract the year from 'date_added' and create a new column 'year_added'
       net['year_added'] = net['date_added'].dt.year
       # fill na with O
       net['year_added'] = net['year_added'].fillna(0).astype(int)
[108]: # head changes
       net.head(15)
[108]:
                                                           title \
          show_id
                      type
                                           Dick Johnson Is Dead
       0
               s1
                     Movie
       1
               s2
                   TV Show
                                                   Blood & Water
       2
               s3 TV Show
                                                       Ganglands
```

Jailbirds New Orleans

Kota Factory

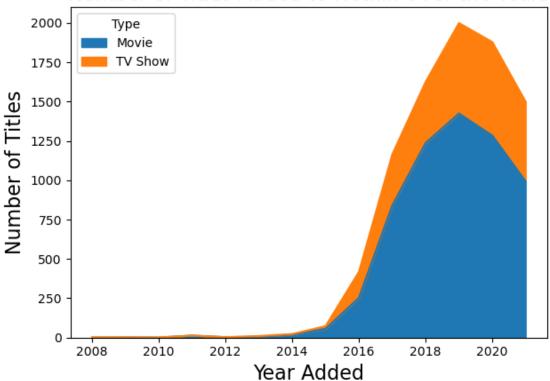
Midnight Mass

```
6
        s7
                         My Little Pony: A New Generation
              Movie
7
        s8
              Movie
                                                    Sankofa
8
        s9
            TV Show
                            The Great British Baking Show
9
       s10
              Movie
                                               The Starling
                      Vendetta: Truth, Lies and The Mafia
10
       s11
            TV Show
11
       s12
            TV Show
                                          Bangkok Breaking
12
       s13
              Movie
                                               Je Suis Karl
13
       s14
              Movie
                         Confessions of an Invisible Girl
                          Crime Stories: India Detectives
14
       s15
            TV Show
                          director
0
                   Kirsten Johnson
1
                                NaN
2
                   Julien Leclercq
3
                               NaN
4
                               NaN
5
                     Mike Flanagan
6
    Robert Cullen, José Luis Ucha
7
                      Haile Gerima
8
                   Andy Devonshire
9
                    Theodore Melfi
10
                               NaN
11
                Kongkiat Komesiri
12
              Christian Schwochow
13
                     Bruno Garotti
14
                               NaN
                                                    cast
                                                         \
0
                                                     NaN
    Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...
1
2
    Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...
3
4
    Mayur More, Jitendra Kumar, Ranjan Raj, Alam K...
5
    Kate Siegel, Zach Gilford, Hamish Linklater, H...
    Vanessa Hudgens, Kimiko Glenn, James Marsden, ...
6
7
    Kofi Ghanaba, Oyafunmike Ogunlano, Alexandra D...
    Mel Giedroyc, Sue Perkins, Mary Berry, Paul Ho ...
8
9
    Melissa McCarthy, Chris O'Dowd, Kevin Kline, T...
10
                                                     NaN
    Sukollawat Kanarot, Sushar Manaying, Pavarit M...
    Luna Wedler, Jannis Niewöhner, Milan Peschel, ...
    Klara Castanho, Lucca Picon, Júlia Gomes, Marc...
14
                                                     NaN
                                                 country date_added \
0
                                          United States 2021-09-25
1
                                           South Africa 2021-09-24
```

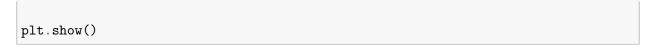
```
2
                                                     NaN 2021-09-24
3
                                                     NaN 2021-09-24
4
                                                   India 2021-09-24
5
                                                     NaN 2021-09-24
6
                                                     NaN 2021-09-24
7
    United States, Ghana, Burkina Faso, United Kin... 2021-09-24
8
                                         United Kingdom 2021-09-24
9
                                          United States 2021-09-24
10
                                                     NaN 2021-09-24
11
                                                     NaN 2021-09-23
12
                                Germany, Czech Republic 2021-09-23
13
                                                     NaN 2021-09-22
14
                                                     NaN 2021-09-22
                           duration
    release_year rating
0
             2020
                   PG-13
                              90 min
1
            2021
                   TV-MA
                          2 Seasons
2
            2021
                   TV-MA
                            1 Season
3
            2021
                   TV-MA
                           1 Season
4
            2021
                   TV-MA
                          2 Seasons
5
            2021
                   TV-MA
                           1 Season
6
            2021
                      PG
                              91 min
7
            1993
                   TV-MA
                             125 min
8
            2021
                   TV-14
                          9 Seasons
9
            2021
                   PG-13
                             104 min
10
            2021
                   TV-MA
                           1 Season
11
            2021
                  TV-MA
                           1 Season
                            127 min
12
            2021
                   TV-MA
                              91 min
13
            2021
                   TV-PG
14
            2021
                            1 Season
                   TV-MA
                                               listed_in \
0
                                          Documentaries
1
      International TV Shows, TV Dramas, TV Mysteries
2
    Crime TV Shows, International TV Shows, TV Act...
3
                                 Docuseries, Reality TV
4
    International TV Shows, Romantic TV Shows, TV ...
5
                    TV Dramas, TV Horror, TV Mysteries
6
                               Children & Family Movies
7
     Dramas, Independent Movies, International Movies
8
                          British TV Shows, Reality TV
9
                                       Comedies, Dramas
10
    Crime TV Shows, Docuseries, International TV S...
11
    Crime TV Shows, International TV Shows, TV Act...
12
                          Dramas, International Movies
13
                    Children & Family Movies, Comedies
14
         British TV Shows, Crime TV Shows, Docuseries
```

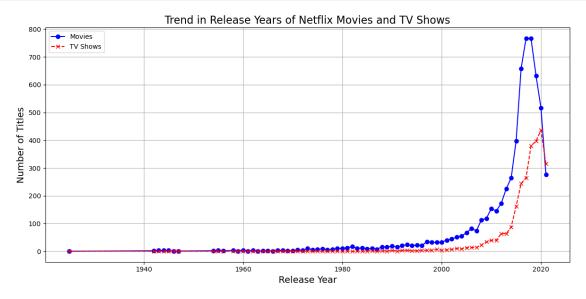
```
description year_added
      0
          As her father nears the end of his life, filmm...
                                                                  2021
          After crossing paths at a party, a Cape Town t...
      1
                                                                  2021
          To protect his family from a powerful drug lor...
                                                                  2021
      2
          Feuds, flirtations and toilet talk go down amo...
      3
                                                                  2021
      4
          In a city of coaching centers known to train I...
                                                                  2021
      5
          The arrival of a charismatic young priest brin...
                                                                  2021
          Equestria's divided. But a bright-eyed hero be...
                                                                  2021
      6
      7
          On a photo shoot in Ghana, an American model s...
                                                                  2021
          A talented batch of amateur bakers face off in...
      8
                                                                  2021
          A woman adjusting to life after a loss contend...
                                                                  2021
      10 Sicily boasts a bold "Anti-Mafia" coalition. B...
                                                                  2021
      11 Struggling to earn a living in Bangkok, a man ...
                                                                  2021
      12 After most of her family is murdered in a terr...
                                                                  2021
      13 When the clever but socially-awkward Tetê join...
                                                                  2021
      14 Cameras following Bengaluru police on the job ...
                                                                  2021
[129]: # Graph 1
      titles_by_year_type_cleaned = net[net['year_added'] > 0].groupby(['year_added',__
        titles_by_year_type_cleaned.plot(kind='area')
      plt.title('Number of Titles Added to Netflix Over the Years', fontsize=16)
      plt.xlabel('Year Added', fontsize=16)
      plt.ylabel('Number of Titles', fontsize=16)
      plt.legend(title='Type')
      plt.tight_layout()
      plt.show()
```

## Number of Titles Added to Netflix Over the Years



```
[110]: # Graph 2
       # prepare the data
       release_counts = net[net['release_year'] > 0].groupby(['release_year', 'type']).
        ⇒size().unstack(fill_value=0)
[111]: # plot
       plt.figure(figsize=(12, 6))
       plt.plot(release_counts.index, release_counts['Movie'], label='Movies',__
        →marker='o', linestyle='-', color='blue')
       plt.plot(release_counts.index, release_counts['TV Show'], label='TV Shows', __
        ⇔marker='x', linestyle='--', color='red')
       plt.title('Trend in Release Years of Netflix Movies and TV Shows', fontsize=16)
       plt.xlabel('Release Year', fontsize=14)
       plt.ylabel('Number of Titles', fontsize=14)
       plt.legend()
       plt.grid(True)
      plt.tight_layout()
```





```
[117]: # move 3 duration rows from rating to duration
       # update the 'duration' column for each 'show_id'
       net.loc[net['show_id'] == 's5542', 'duration'] = '74 min'
       net.loc[net['show_id'] == 's5795', 'duration'] = '84 min'
       net.loc[net['show_id'] == 's5814', 'duration'] = '66 min'
       # update the 'duration' column for each 'show_id'
       net.loc[net['show_id'] == 's5542', 'rating'] = 'na'
       net.loc[net['show_id'] == 's5795', 'rating'] = 'na'
       net.loc[net['show_id'] == 's5814', 'rating'] = 'na'
[119]: # check changes print row
       print(net[net['show_id'] == 's5542'])
           show_id
                                     title
                                              director
                                                                          country \
                     type
                                                              cast
      5541
             s5542 Movie Louis C.K. 2017 Louis C.K. Louis C.K.
                                                                    United States
           date_added release_year rating duration listed_in \
      5541 2017-04-04
                               2017
                                        na
                                             74 min
                                                       Movies
                                                  description year_added
      5541 Louis C.K. muses on religion, eternal love, gi...
```

```
[134]: # Graph 3
# prepare the data

# drop the null/na
df_clean = net.dropna(subset=['rating'])

ratings_count = df_clean['rating'].value_counts()

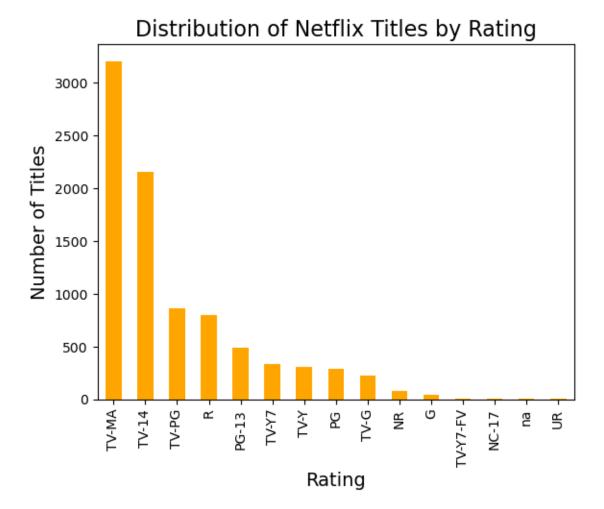
sorted_ratings_count = ratings_count.sort_values(ascending=False)

[135]: # Plot
sorted_ratings_count.plot(kind='bar', color='orange')
```

```
[135]: # Plot
sorted_ratings_count.plot(kind='bar', color='orange')

plt.title('Distribution of Netflix Titles by Rating', fontsize=16)
plt.xlabel('Rating', fontsize=14)
plt.ylabel('Number of Titles', fontsize=14)

plt.show()
```



## 0.0.5 Explain what you have learned from each of your graphs.

Graph 1 is a area graph and compares the number of titles added to Netflix from 2008 to 2021. The graph shows year of year growth between 2013 and 2019 for Movies and 2013 to 2020 for TV Shows, with movies growing at a more than double clip between 2017 to 2021. There is slight downturn for movies from 2020 to 2021 and only a slight down turn for TV Shows for 2021.

Graph 2 is a line graph with markers. It compares the number of Netflix movies and TV shows released over time, with the release years on the x-axis and the number of titles on the y-axis. Movies are represented by a blue line with circle markers and a solid line style, while TV shows are indicated by a red line with 'x' markers and a dashed line style. The graph shows that early released years Movies and TV Shows trended equally together. However, begining with release years in 1980 Movies grew at a higher clip than TV Shows with this trend maintaining through the late 2000 teens, with both Movies and TV Shows dropping dramatically by 2020.

Graph 3 is an bar graph that displays the distribution of Netflix titles by rating. By far the most popular rating of Movies and TV Shows is TV-MA, followed by TV-14, TV-PG, R, PG-13, TV-Y7, TV-Y, PG, TV\_G. The other ratings were negligable.

#### 0.0.6 Conclusion

#### Content Growth Over Time

The analysis of how the number of titles on Netflix has changed over the years shows a significant increase in both movies and TV shows, with perhaps a more pronounced growth in recent years (excluding the COVID time). This could be attributed to Netflix's shift towards becoming a primary content creator and distributor, leading to an aggressive expansion of its library to attract and retain subscribers. The difference in growth rates between movies and TV shows reflects strategic decisions by Netflix to invest more heavily in one type of content based on viewer preferences and market trends.

#### Release Patterns

The trend in the release years of movies and TV shows on Netflix likely indicates an increasing focus on recent content, although a substantial number of older titles remain important for catalog diversity. There might be spikes in certain years, correlating with Netflix's investments in original content or exclusive streaming rights acquisitions. The analysis could reveal that while Netflix places a strong emphasis on new releases to keep its library fresh and engaging, it also values classic and evergreen titles that cater to a broad audience spectrum.

#### Ratings Analysis

The most common ratings among Netflix titles, such as PG, TV-MA, etc., suggest a targeted approach by Netflix towards certain demographic groups. For instance, the predominance of TV-MA (Mature Audience) rated titles indicates Netflix's focus on adult viewers, offering a wide range of content from intense dramas to adult comedies and documentaries. The lower ratings like PG or PG-13 reflects Netflix's strategy to not overly cater to families and younger viewers with a variety of movies and shows that are suitable for a younger audience. The diversity in ratings can highlight

Netflix's intention to appeal to a global audience with varied tastes and preferences, aiming to be a one-stop entertainment solution for people of all ages.

#### Overall Conclusion

The analysis based on the graphs produced in the notebook reveals Netflix's evolving content strategy, emphasizing a balanced mix of movies and TV shows to cater to a wide audience. The growth in titles over the years underscores Netflix's commitment to expanding its library, both through acquisitions and the production of original content. Release patterns hint at a strategic focus on fresh and relevant content while maintaining a selection of classics and evergreen titles. Finally, the ratings analysis suggests that Netflix aims to serve a more of an adult audience base.

[]: