

EDA of Netflix Dataset using Plotly

We are going to talk about some of the advanced and most used charts in Plotly while doing analysis. All you need to know is Plotly for visualization!

- · Description of Dataset
- Data Exploration
- Data Cleaning
- Data visualization
- · The questions which we are going to answer with the charts
 - o Correlation between the features
 - o Most watched shows on the Netflix
 - o Distribution of Ratings
 - Which has the highest rating Tv show or Movies
 - o Finding the best Month for releasing content
 - o Highest watched genres on Netflix
 - o Released movie over the years

Netflix is an application that keeps growing exponentially whole around the world and it is the most famous streaming platform.

Dataset: https://www.kaggle.com/shivamb/netflix-shows

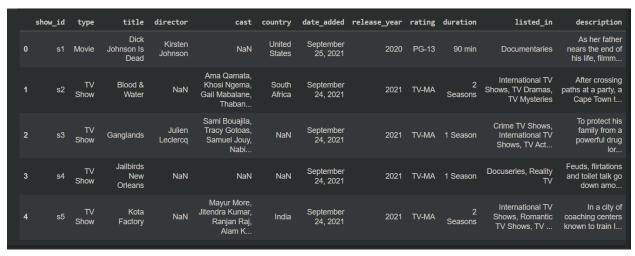
Let's create an EDA through this data with beautiful charts and visuals to gain some insights.

Importing Libraries

import pandas as pd
import plotly.express as px
import plotly.graph_objects as go
from plotly.subplots import make_subplots
import plotly.figure_factory as ff

Let's see the Netflix data:

netflix_data = pd.read_csv('/content/netflix_titles.csv')
netflix_data.head()



Dataset

Description of Netflix Dataset

This dataset contains data collected from Netflix of different TV shows and movies from the year 2008 to 2021.

- type: Gives information about 2 different unique values one is TV Show and another is Movie
- title: Gives information about the title of Movie or TV Show
- · director: Gives information about the director who directed the Movie or TV Show
- · cast: Gives information about the cast who plays role in Movie or TV Show
- release_year: Gives information about the year when Movie or TV Show was released
- rating: Gives information about the Movie or TV Show are in which category (eg like the movies are only for students, or adults, etc)
- · duration: Gives information about the duration of Movie or TV Show
- listed_in: Gives information about the genre of Movie or TV Show
- description: Gives information about the description of Movie or TV Show

Data Exploration

Exploraing the data

netflix_data.info()

Finding if the dataset contains null values or not.

```
netflix_data.isnull().sum() #returns the number of missing values
```

```
show_id
                 0
type
                 0
title
                 0
director
              2634
cast
               825
country
release_year 0
rating
duration
listed in
description
                 0
dtype: int64
```

Finding how many unique vales are present in the dataset.

```
netflix_data.nunique()
```

```
show id
               8807
type
title
               8807
director
               4528
cast
               7692
country
                748
date_added
               1767
release_year
rating
duration
                220
listed_in
                514
description
               8775
dtype: int64
```

Data Cleaning

Dropping the cast and director features because we are not going to use those features right now.

```
netflix_data = netflix_data.dropna(how='any', subset=['cast', 'director'])
netflix_data = netflix_data.dropna()
```

Replacing null values with 'missing'

```
#Replacing Null values with 'missing'
netflix_data['country'].fillna('missing', inplace=True )
netflix_data['date_added'].fillna('missing', inplace=True )
netflix_data['rating'].fillna('missing', inplace=True )
netflix_data.isnull().sum().sum()
```

Converting into a proper date-time format and adding two more features year and month.

```
# Converting date_added into proper format
netflix_data["date_added"] = pd.to_datetime(netflix_data['date_added'])
netflix_data['year_added'] = netflix_data['date_added'].dt.year
netflix_data['month_added'] = netflix_data['date_added'].dt.month
```

Finding seasons from durations

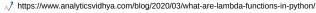
```
# finding seasons from durations
netflix_data['season_count'] = netflix_data.apply(lambda x : x['duration'].split(" ")[0] if "Season" in x['duration'] else "", axis = 1)
netflix_data['duration'] = netflix_data.apply(lambda x : x['duration'].split(" ")[0] if "Season" not in x['duration'] else "", axis = 1)
```

Renaming the 'listed_in' feature to the genre for easy use.

```
#Renaming the 'listed_in' feature to the genre for easy use.
netflix_data = netflix_data.rename(columns={"listed_in":"genre"})
netflix_data['genre'] = netflix_data['genre'].apply(lambda x: x.split(",")[0])
```

What Are Lambda Functions | Lambda Function In Python

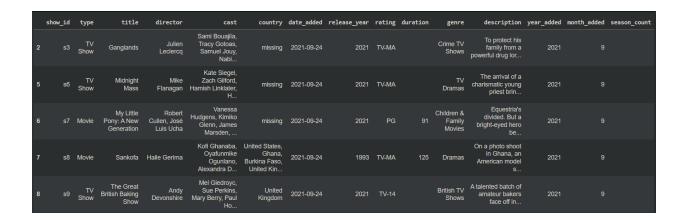
For loops are the antithesis of efficient programming. They're still necessary and are the first conditional loops taught to Python beginners but in my opinion, they leave a lot to be desired. These for loops can be cumbersome and can make our Python code bulky and untidy.





After cleaning the dataset, data will look like as follows:

netflix_data.head()



Data Visualization

Before going to deep dive into visualization, let's first get clear with some Parameters which are commonly used.

Basic Parameters

- height, width: Giving height & width of the chart respectively
- color_discrete_sequence: Specifying which colors you want in your chart
- margin: By setting values of Top, Bottom, Left, and Right you can change the margin of the graph
- plot_bgcolor: Plotly provides different templates and themes you can use that also or you can create your own theme.
- showgrid: The grid lines which are present in the chart. You can hide it by showgrid=False

Advanced Parameters

- · categoryorder: If you want your chart to show in ascending or decsending order you can specify values here
- hovermode: While hovering on the bar you can specify in which mode you want like x hovermode or y hovermode.
- hovertemplate: While hovering on the data you can specify a format like how you want to look the data
- xaxis_title, yaxis_title: Specify the xaxis title & yaxis title respectively
- title: Giving a Title of the chart
- title_font
 - o size: Setting the font size of the title
 - o color: Setting the color of the title
 - o family: Setting the font-family of the title
- font
 - $\circ~$ size: Setting the font size of font in chart
 - o color: Setting the color of font in chart

o family: Setting the font-family of the font in chart

Now let's start the fun and gain some insights from the data.

If we look at the data, we have some questions ready like

- What is the ratio of Movie and TV Shows on Netflix
- · Distribution of Rating in Netflix
- Which has the highest rating Tv Shows or Movies on Netflix

and many more questions...

Chart 01

Viewing the correlation between the features.



HeatMap in Plotly

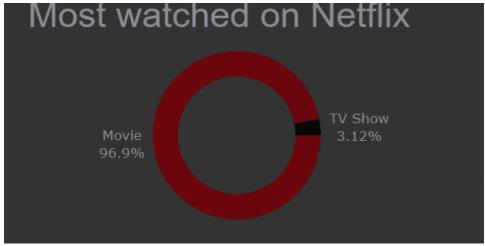
Chart 02

The reason for plotting this chart?

This will tell us about the most watched shows on Netflix, what exactly audience prefers to watch whether it's TV shows or series. So that, Netflix can decide what type of content they should publish to make the audience happy and they can make profit.

Parameters:

- textposition: The values of Movie & TV Show are shown outside of the chart by giving textposition=outside
- textinfo: What information you want to shown while hovering on the chart is specified here
- rotation: Giving different rotation to the chart to make chart presentable
- pull: What data and percent of data you want to pull you specified here
- hole: You can specify any values between 0 to 1 to make hole.



Donut chart in Plotly

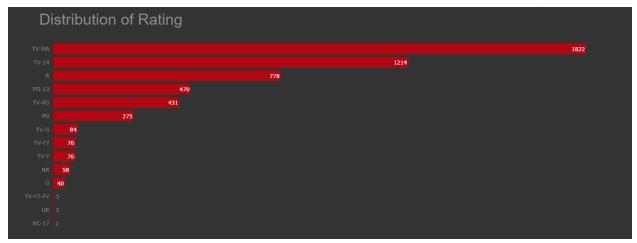
Audience prefers Movies over TV Shows as 97% audience like Movie.

Chart 03

Distribution of Rating and finding what audience prefer to watch.

The reason for plotting the chart?

To know which type of content is most watched by the audience so that Netflix can decide what type of content to be released next. It helps Netflix to understand the most and least favourite content watched by an audience.



Bar Chart

The audience prefers TV-MA and TV-14 shows more and the least preferred rating shows are Nc-17. Most of the content watched by the audience is for a mature audience. The TV-MA rating is a type of rating given by the TV parental guidelines to a television program.

The second largest type of rating watched by the audience is TV-14 which is inappropriate for children younger than age 14. The conclusion is drawn here is most of the audience is of mature age.

Chart 04

We will see which has the highest rating TV Shows or Movies.

The reason for plotting the chart?

Bidirectional bar chart compares between the TV shows and Movies vs Ratings.

Creating two different bar charts one for TV Show and another for Movie doesn't make sense but combining a user can easily understand the difference.

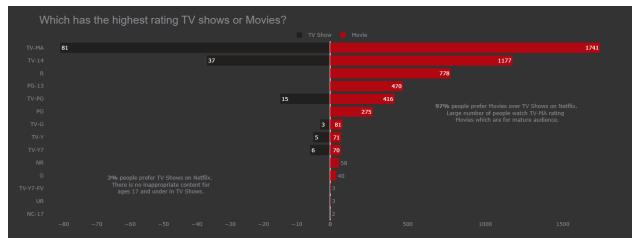
```
# making a copy of netflix_data
dff = netflix_data.copy()

# making 2 df one for tv show and another for movie with rating
df_tv_show = dff[dff['type']=='Tv Show'][['rating', 'type']].rename(columns={'type':'tv_show'})
df_movie = dff[dff['type']=='Movie'][['rating', 'type']].rename(columns={'type':'movie'})
df_tv_show = pd.DataFrame(df_tv_show.rating.value_counts()).reset_index().rename(columns={'index':'tv_show'})
df_tv_show['rating_final'] = df_tv_show['rating']
# making rating column value negative
df_tv_show['rating'] *= -1
df_movie = pd.DataFrame(df_movie.rating.value_counts()).reset_index().rename(columns={'index':'movie'})
```

Here for the bi-directional chart, we will make 2 different data frames one for Movies and another one for TV Shows having ratings in them.

We are making 2 subplots and they are sharing the y-axis.

```
\label{fig:make_subplots} fig = make\_subplots(rows=1, cols=2, specs=[[\{\}, \{\}]], shared\_yaxes=True, horizontal\_spacing=0)
# bar plot for tv shows
fig.append trace(go.Bar(x=df tv_show.rating, y=df tv_show.tv_show, orientation='h', showlegend=True,
                                                                text=df_tv_show.rating_final, name='TV Show', marker_color='#221f1f'), 1, 1)
# bar plot for movies
fig. append\_trace(go.Bar(x=df\_movie.rating, y=df\_movie.movie, orientation='h', showlegend=True, text=df\_movie.rating, description of the property of the pro
                                                                name='Movie', marker_color='#b20710'), 1, 2)
fig.update_xaxes(showgrid=False)
fig.update_traces(hovertemplate=None, marker=dict(line=dict(width=0)))
\verb|fig.update_layout(title='Which has the highest rating TV shows or Movies?', \\
                                                margin=dict(t=80, b=0, l=70, r=40),
                                                 hovermode="y unified",
xaxis_title=' ', yaxis_title=" ",
                                                 plot_bgcolor='#333', paper_bgcolor='#333',
                                                 title_font=dict(size=25, color='#8a8d93', family="Lato, sans-serif"),
                                                  font=dict(color='#8a8d93'),
                                                  legend=dict(orientation="h", yanchor="bottom", y=1, xanchor="center", x=0.5),\\
                                                 hoverlabel=dict(bgcolor="black", font_size=13, font_family="Lato, sans-serif"))
```



Bi-directional Bar Chart



Chart 05

If a producer wants to release a show which month is the best month to release it.

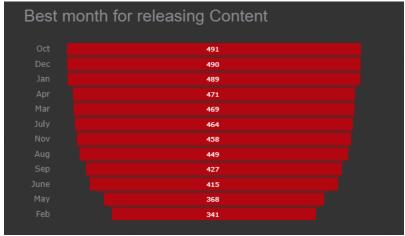
The reason for plotting the chart.?

The best month to release content so the producer can gain much revenue. Most of the holidays came in December month so to releases a Movie or TV show in December is the best way to earn a lot of profit as the whole family will be spending time with each other and watching shows.

```
netflix_month = pd.DataFrame(netflix_data.month_added.value_counts()).reset_index().rename(columns={'index':'month', 'month_added':'count'})
# Replacing month number to month name for a better visualization
```

 $netflix_month['month_final'] = netflix_month['month'].replace(\{1:'Jan', 2:'Feb', 3:'Mar', 4:'Apr', 5:'May', 6:'June', 7:'July', 8:'Aug', 9: netflix_month[:4]$

	month	count	month_final	
0	10	491	Oct	
1	12	490	Dec	
2	1	489	Jan	
3	4	471	Apr	



Funnel Chart

Parameters:

add_annotationx, **y**: Setting the values of x,y for showing the text**text**: Add the text which you want to show on the chart

Ending and starting of the year December and January is the best month to release content. The best 4 months to release content are October, November, December, and January.

Chart 06

Finding the highest watched genres on Netflix.

The reason for plotting the chart?

To know more about the distribution of genres and see which type of content do audience prefers to watch. So Netflix can decide and take movies or tv shows of the highest watched genres which will benefit Netflix in a long run.

Highest watched Geners on Netflix



TreeMap

<u>Drama is the highest preferred show by the audience then comes the comedy show and action show, the least preferred show is of LGBTQ movies.</u>

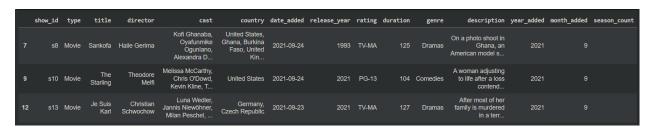
Chart 07

Let's see how many movies were released over the years with a waterfall chart.

The reason for plotting the chart?

We want to see what is the distribution of releases of a movie or tv show in terms of years. Do the releases increase or decrease with the years. We can easily compare if the release of movies is decreasing or increasing by year by year with the help of a waterfall chart.

```
# creating a dataframe which only consists of Movie shows
d2 = netflix_data[netflix_data["type"] == "Movie"]
d2[:3]
```



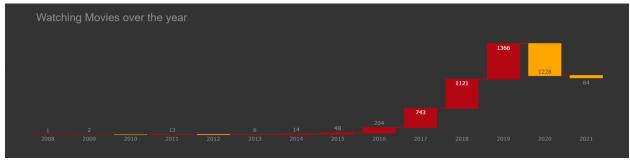
```
# creating a dataframe which shows how many movies were released each year
col = "year_added"

vc2 = d2[col].value_counts().reset_index().rename(columns = {col : "count", "index" : col})
vc2['percent'] = vc2['count'].apply(lambda x : 100*x/sum(vc2['count']))
vc2 = vc2.sort_values(col)
vc2[:3]
```

	year_added	count	percent
13	2008	1	0.019286
11	2009	2	0.038573
12	2010	1	0.019286

```
# Waterfall Chart
fig2 = go.Figure(go.Waterfall(
   name = "Movie", orientation = "v",

x = ["2008", "2009", "2010", "2011", "2012", "2013", "2014", "2015", "2016", "2017", "2018", "2019", "2020", "2021"],
    textposition = "auto",
    \mathsf{text} \ = \ ["1", \ "2", \ "1", \ "13", \ "3", \ "6", \ "14", \ "48", \ "204", \ "743", \ "1121", \ "1366", \ "1228", \ "84"],
     y = [1, 2, -1, 13, -3, 6, 14, 48, 204, 743, 1121, 1366, -1228, -84], \\ connector = \{"line": \{"color": "#b20710"\}\}, 
    increasing = {"marker":{"color":"#b20710"}},
    decreasing = {"marker":{"color":"orange"}},
))
fig2.update_xaxes(showgrid=False)
fig2.update_yaxes(showgrid=False, visible=False)
fig2.update_traces(hovertemplate=None)
fig2.update_layout(title='Watching Movies over the year', height=350,
                     margin=dict(t=80, b=20, l=50, r=50),
                     hovermode="x unified",
                     xaxis_title=' ', yaxis_title=" ",
                      plot_bgcolor='#333', paper_bgcolor='#333',
                      title_font=dict(size=25, color='#8a8d93', family="Lato, sans-serif"),
                      font=dict(color='#8a8d93'))
```



Waterfall Chart

Here yellow color shows the decrement and the red color shows the increment.

Parameters:

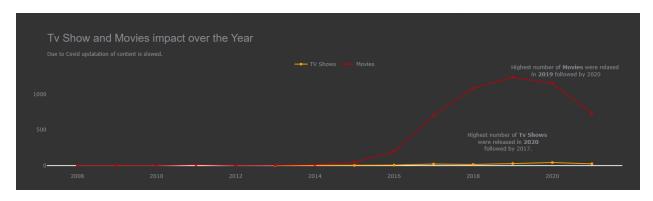
connector: Specify the color for connecting two bar increasing, decreasing: Specify the colors for the increasing and decreasing bar.

The highest number of movies were released in 2019 and 2018 due to the covid releasing of movies were significantly dropped.

Chart 08

What is the impact of Netflix TV Shows or Movies over the years by comparing both.

```
d1 = netflix_data[netflix_data["type"] == "TV Show"]
d2 = netflix_data[netflix_data["type"] == "Movie"]
col = "year_added"
vc1 = d1[col].value_counts().reset_index().rename(columns = {col : "count", "index" : col})
\label{eq:vc1['percent'] = vc1['count'].apply(lambda x : 100*x/sum(vc1['count']))} \\
vc1 = vc1.sort_values(col)
vc2 = d2[col].value_counts().reset_index().rename(columns = {col : "count", "index" : col})
vc2['percent'] = vc2['count'].apply(lambda x : 100*x/sum(vc2['count']))
vc2 = vc2.sort_values(col)
trace1 = go.Scatter(x=vc1[col], y=vc1["count"], name="TV Shows", marker=dict(color="orange"), )
trace2 = go.Scatter(x=vc2[col], y=vc2["count"], name="Movies", marker=dict(color="#b20710"))
data = [trace1, trace2]
fig_line = go.Figure(data)
fig_line.update_traces(hovertemplate=None)
fig_line.update_xaxes(showgrid=False)
fig_line.update_yaxes(showgrid=False)
large_title_format = 'Tv Show and Movies impact over the Year'
small_title_format = "<span style='font-size:13px; font-family:Tahoma'>Due to Covid updatation of content is slowed." fig_line.update_layout(title=large_title_format + "<br>" + small_title_format, height=400,
                                        margin=dict(t=130, b=0, l=70, r=40),
                                        hovermode="x unified",\\
                                        xaxis_title=' ', yaxis_title=" ",
                                        plot_bgcolor='#333', paper_bgcolor='#333',
                                        title_font=dict(size=25, color='#8a8d93', family="Lato, sans-serif"),
                                        font=dict(color='#8a8d93'),
                                        legend=dict(orientation="h", yanchor="bottom", y=1, xanchor="center", x=0.5))\\
\label{fig_line.add_annotation(dict(x=0.8, y=0.3, ax=0, ay=0, y=0.8, y
                                           xref = "paper", yref = "paper"
                                            {\tt text="Highest number of <b>Tv Shows</b><bre> were released in <b>2020</b><bre> followed by 2017."}
\label{fig_line.add_annotation(dict(x=0.9, y=1, ax=0, ay=0,
                                           xref = "paper", yref = "paper",
                                            text= "Highest number of <b>Movies</b> were relased<br> in <b>2019</b> followed by 2020"
 fig_line.show()
```



After the year 2019 covid came that badly affects Netflix for producing content. Movies have exponential growth from the start but due to covid, it is going downwards.

We explored the Netflix dataset and saw how to clean the data and then jump into how to visualize the data. We saw some basic and advanced level charts of Plotly like Heatmap, Donut chart, Bar chart, Funnel chart, Bi-directional Bar chart, Treemap, Waterfall chart, Line chart.

Google Colaboratory

 $\begin{tabular}{ll} G & https://colab.research.google.com/drive/1UKDiQwATkBuMko3Oc2DV-gMRzAtZfBnY?authuser=1\#scrollTo=RWK9pxwbHlbX \end{tabular} \\ \begin{tabular}{ll} K9pxwbHlbX \end{tabular} \end{tabular} \label{tabular}$

