Netflix **Netflix-Data Exploration and Visualisation Business Problem** Analyze the data and generate insights that could help Netflix team deciding which type of shows/movies to produce and how they can grow the business in different countries 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. Importing libraries import numpy as np In [163... import pandas as pd import matplotlib.pyplot as plt import seaborn as sns Reading File df=pd.read csv('netflix.csv') In [164.. First 10 rows df.head(10) In [165. date added release year rating Out[165]: show id title director description type cast duration listed_in As her Dick father nears Kirsten United September 0 Movie Johnson Is NaN 2020 PG-13 90 min Documentaries the end of Johnson States 25, 2021 Dead his life, filmm... Ama After Qamata, International crossing TV-2 TV Blood & Khosi South September TV Shows, TV paths at a 2021 s2 NaN 24, 2021 Show Water Ngema, Gail Africa MA Seasons Dramas, TV party, a Mabalane, Mysteries Cape Town Thaban... t... Sami Crime TV To protect Bouajila, Shows, his family Julien ΤV September 2 2021 s3 Ganglands Tracy Gotoas, NaN 1 Season International from a Leclercq Show 24, 2021 MA Samuel Jouy, TV Shows, TV powerful Nabi... Act... drug lor... Feuds, flirtations **Jailbirds** TV TVand toilet September Docuseries. 3 2021 s4 New NaN NaN NaN 1 Season talk go Show 24, 2021 MA Reality TV Orleans down amo... Mayur More, In a city of International Jitendra coaching 2 TV Shows. TV Kota TV-September s5 NaN Kumar, India 2021 centers Show 24, 2021 MA Seasons Romantic TV Factory Ranjan Raj, known to Shows, TV ... Alam K... train I... The arrival Kate Siegel, TV Dramas, TV of a September TV Midnight Mike Zach Gilford, 5 2021 NaN 1 Season Horror, TV s6 charismatic Show Mass Flanagan Hamish 24, 2021 MA Mysteries young Linklater, H... priest brin... Equestria's Vanessa My Little Robert divided. But Hudgens, Pony: A Cullen, September Children & 6 s7 Movie 2021 Kimiko NaN PG 91 min a bright-New José Luis 24, 2021 Family Movies eyed hero Glenn, James Generation Ucha Marsden, ... be... United Kofi Dramas, On a photo States, Ghanaba, Ghana, Independent shoot in September Haile Oyafunmike TV-7 1993 Ghana, an s8 Movie Sankofa Burkina 125 min Movies, Gerima 24, 2021 Ogunlano, American Faso, International Alexandra United Movies model s... D... Kin... Mel A talented The Great Giedroyc, British TV batch of Andy TV British United September Sue Perkins, Shows, Reality 8 s9 2021 TV-14 amateur Devonshire Show Baking Kingdom 24, 2021 Seasons Mary Berry, TV bakers face Show Paul Ho... off in... Melissa A woman McCarthy, adjusting to The Theodore Chris United September Comedies, 9 s10 Movie 2021 PG-13 104 min life after a Starling O'Dowd, 24, 2021 Melfi States Dramas loss Kevin Kline, contend... T... Last 10 rows df.tail(10) In [166... $show_id$ Out[166]: title director type date_added release_year rating duration listed_in description cast country Michael United Johnston, States, Teen surfer September TV Jessica France, Zak Storm is 8797 s8798 Zak Storm 2016 TV-Y7 Kids' TV NaN 13, 2018 Gee-South mysteriously George, Korea, transpor... Christin... Indonesia Adil Hussain, Comedies, Chandra philandering Mona December Dramas, 8798 Zed Plus 2014 s8799 Movie Prakash India 131 min small-town MA International Singh, K.K. 31, 2019 Dwivedi mechanic's Raina, Movies political... Sanjay M... Santosh A change in Juvekar, Dramas, the Avadhoot February 15, 8799 s8800 Movie Siddharth India 2009 TV-14 Zenda 120 min International leadership Gupte 2018 Chandekar, Movies of a political Sachit P... part... Sanam Saeed, Strong-International Fawad willed, Zindagi December TV Shows, TV 2012 TV-PG 1 Season 8800 s8801 NaN Khan, Pakistan middle-class Romantic TV Show Gulzar Hai 15, 2016 Ayesha Kashaf and Shows, TV ... Omer, carefre... Mehreen ... Recovering Ali Suliman, United Dramas, alcoholic Majid Al Saleh Bakri, Arab March 9, TV-International 8801 s8802 Movie Zinzana 2015 96 min Talal wakes Ansari 2016 MA Yasa, Ali Al-Emirates, Movies, up inside a Jabri, ... Jordan **Thrillers** Mark A political Ruffalo, Cult Movies, cartoonist, a David Jake United November 8802 s8803 Movie Zodiac 2007 158 min Dramas, crime Gyllenhaal, 20, 2019 Fincher States Thrillers reporter and Robert Downey J... While living Kids' TV TV Zombie Korean TV 8803 NaN NaN NaN July 1, 2019 2018 TV-Y7 spooky Dumb Shows, TV town, a Comedies young g... Jesse Eisenberg, Looking to Comedies, United Ruben Woody November survive in a 8804 s8805 Movie Zombieland 2009 88 min Horror 1, 2019 Fleischer Harrelson, States world taken Movies Emma over by zo... Stone, ... Tim Allen, Children & Dragged Courteney Peter United January 11, Family from civilian 8805 s8806 Movie Zoom Cox, Chevy 2006 PG 88 min Hewitt States Movies, life, a former Chase, Kate Comedies superhero... Ma... Vicky Dramas, A scrappy Kaushal, International but poor Mozez Sarah-Jane March 2, 2015 TV-14 8806 s8807 Movie Zubaan India 111 min Movies, boy worms Singh Dias, 2019 Music & his way into Raaghav Musicals a ty... Chanan... Shape of the dataset df.shape In [167... (8807, 12)Out[167]: Different attributes in data df.columns In [168... Index(['show_id', 'type', 'title', 'director', 'cast', 'country', 'date_added', Out[168]: 'release_year', 'rating', 'duration', 'listed_in', 'description'], dtype='object') Data types of all the attributes df.info() In [169... <class 'pandas.core.frame.DataFrame'> RangeIndex: 8807 entries, 0 to 8806 Data columns (total 12 columns): Column Non-Null Count Dtype _____ 0 show id 8807 non-null object 1 8807 non-null object type 2 8807 non-null object title 3 director 6173 non-null object 4 7982 non-null object cast 5 country 7976 non-null object 6 date added 8797 non-null object 7 release_year 8807 non-null int64 8 rating 8803 non-null object 9 duration 8804 non-null object 10 listed in 8807 non-null object 11 description 8807 non-null object dtypes: int64(1), object(11)memory usage: 825.8+ KB In [170... df['type'].unique() array(['Movie', 'TV Show'], dtype=object) Out[170]: Converting into categorical attributes In [171... df['type']=df['type'].astype('category') Datatype of "type" column changed In [172... df.info() <class 'pandas.core.frame.DataFrame'> RangeIndex: 8807 entries, 0 to 8806 Data columns (total 12 columns): # Column Non-Null Count Dtype show_id 8807 non-null object
type 8807 non-null category
title 8807 non-null object
director 6173 non-null object
cast 7982 non-null object
country 7976 non-null object
date_added 8797 non-null object
release_year 8807 non-null int64 1 7 rating 8803 non-null object duration 8804 non-null object 9 10 listed in 8807 non-null object 11 description 8807 non-null object dtypes: category(1), int64(1), object(10) memory usage: 765.7+ KB Missing value detection df.isnull().sum() In [173... show id Out[173]: type title director cast country date added release_year rating duration listed in description dtype: int64 Statistical summary of "int" data type In [174... df.describe(include='int64') Out[174]: release_year count 8807.000000 2014.180198 mean 8.819312 std min 1925.000000 2013.000000 25% **50%** 2017.000000 2019.000000 2021.000000 max Statistical summary of "object" data type df.describe(include='object').T Out[175]: count unique top freq show_id 8807 8807 s1 1 8807 8807 Dick Johnson Is Dead 19 6173 4528 Rajiv Chilaka director 7982 7692 David Attenborough 19 cast United States 2818 country 7976 748 date_added January 1, 2020 TV-MA 3207 rating 8803 17 8804 duration 220 1 Season 1793 listed_in Dramas, International Movies 8807 514 description 8807 8775 Paranormal activity at a lush, abandoned prope... Unnesting date_added attribute date = df[["date added"]].dropna() In [176... In [177... date['year'] = date["date added"].apply(lambda i: i.split(', ')[1]) date['month'] = date["date added"].apply(lambda i: i.lstrip().split(' ')[0]) In [178... date['year'].head() 2021 Out[178]: 2021 2 2021 3 2021 4 2021 Name: year, dtype: object In []: In []: date['month'].head() In [179... September Out[179]: September 2 September 3 September 4 September Name: month, dtype: object Non-Graphical Analysis: Value counts and unique attributes. Unique values of "type" attribute df['type'].unique() In [180... ['Movie', 'TV Show'] Out[180]: Categories (2, object): ['Movie', 'TV Show'] Total count of unique values in "type" attribute In [181... df["type"].value counts() 6131 Movie Out[181]: TV Show 2676 Name: type, dtype: int64 **Insights**: Total number of movies is greater than TV shows Unique values of month which movies/tv shows are added date['month'].unique() In [182... array(['September', 'August', 'July', 'June', 'May', 'April', 'March', Out[182]: 'February', 'January', 'December', 'November', 'October'], dtype=object) date['month'].value counts() In [183... 827 July Out[183]: December 813 September 770 April October 755 August March 742 January 738 June November May 632 February 563 Name: month, dtype: int64 Insights: Most of movies and TV shows are added on Netflix in july Unique values of year which movies/tv shows are added date['year'].unique() In [184... array(['2021', '2020', '2019', '2018', '2017', '2016', '2015', '2014', Out[184]: '2013', '2012', '2011', '2009', '2008', '2010'], dtype=object) date['year'].value_counts() In [185... 2016 2019 Out[185]: 2020 1879 2018 1649 2021 1498 2017 1188 2016 429 2015 82 2014 24 2011 13 2013 11 2012 3 2009 2 2008 2 2010 1 Name: year, dtype: int64 Insights: Most of movies and TV shows are added on Netflix in 2019 Unique values of "release_year" attribute In [186... df['release year'].unique() array([2020, 2021, 1993, 2018, 1996, 1998, 1997, 2010, 2013, 2017, 1975, Out[186]: 1978, 1983, 1987, 2012, 2001, 2014, 2002, 2003, 2004, 2011, 2008, 2009, 2007, 2005, 2006, 1994, 2015, 2019, 2016, 1982, 1989, 1990, 1991, 1999, 1986, 1992, 1984, 1980, 1961, 2000, 1995, 1985, 1976, 1959, 1988, 1981, 1972, 1964, 1945, 1954, 1979, 1958, 1956, 1963, 1970, 1973, 1925, 1974, 1960, 1966, 1971, 1962, 1969, 1977, 1967, 1968, 1965, 1946, 1942, 1955, 1944, 1947, 1943], dtype=int64) Total count of unique values in "release_year" attribute In [187... df['release year'].value counts() 2018 1147 Out[187]: 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 Insights: Most number of movies and TV shows are released in 2018 Unique values of "rating" attribute df['rating'].unique() In [188... array(['PG-13', 'TV-MA', 'PG', 'TV-14', 'TV-PG', 'TV-Y', 'TV-Y7', 'R', Out[188]: 'TV-G', 'G', 'NC-17', '74 min', '84 min', '66 min', 'NR', nan, 'TV-Y7-FV', 'UR'], dtype=object) Total count of unique values in "rating" attribute df['rating'].value_counts().head() In [189... 3207 TV-MA Out[189]: TV-14 2160 TV-PG 863 799 PG-13 490 Name: rating, dtype: int64 Insights: Most number of movies and TV shows are rated as TV-MA Visual Analysis - Univariate, Bivariate after pre-processing of the data Comparing movies and TV shows on Netflix In [190... plt.figure(figsize=(5,5)) typ=df["type"].dropna().value_counts().rename_axis('type').reset_index(name='counts') sns.barplot(data=typ, x="type",y='counts') plt.title('Comparison of movies and TV shows') plt.show() Comparison of movies and TV shows 6000 5000 4000 3000 2000 1000 TV Show Movie type Insights: Total number of movies is more than TV shows Trend of content produced on Netflix over the last 22 years In [191... | plt.figure(figsize=(10,8)) data movies=df[df['type']=="Movie"] x_movies=list(data_movies.groupby(['release_year'])['title'].nunique().tail(22).index) y_movies=list(data_movies.groupby(['release_year'])['title'].nunique().tail(22)) sns.lineplot(x=x_movies, y=y_movies, label="Movie") data_shows=df[df['type']=="TV Show"] x_shows=list(data_shows.groupby(['release_year'])['title'].nunique().tail(22).index) y_shows=list(data_shows.groupby(['release_year'])['title'].nunique().tail(22)) sns.lineplot(x=x_shows,y=y_shows,label="TV Show") plt.xticks(np.arange(2000, 2022, step=2), rotation = 90) plt.xlabel('Release year') plt.ylabel("Release count") plt.title("Trend of content on Netflix") plt.legend() plt.show() Trend of content on Netflix 800 Movie TV Show 700 600 500 Release count 400 300 200 100 0 2000 2008 2010 2014 2020 2002 2004 2012 Release year Insights: Till 2018 the trend of movies was higher than that of TV shows. But after 2018 movies is showing decrease in trend. In 2021 TV shows trend is higher Recommendation: Netflix should produce more TV shows than movies as per the trend. Release Year of Movies/TV shows from 2000 plt.figure(figsize=(10,8)) In [192... ry=df['release_year'].astype("Int64") gh = sns.histplot(x = ry,bins=np.arange(2000, 2022, step=2))plt.title('Release Year of movies/TV shows from 2000') plt.xlabel('Release year') for i in gh.patches: $gh.annotate('\{:.0f\}'.format(i.get_height()),(i.get_x()+2.5,i.get_height()+50))$ plt.xticks(np.arange(2000, 2022, step =2)) plt.show() Release Year of movies/TV shows from 2000 3130 3000 2500 1934 2000 1500 1000 912 525 500 379 82 2000 2002 2004 2006 2008 2010 2012 2014 2016 2018 2020 Release year Insights: Most of Movies/TV shows are released between the year 2018 and 2020 Top 5 years when most number of movies / TV shows are released In [193... plt.figure(figsize=(5,5)) rys=df['release_year'].dropna().value_counts().rename_axis('release_year').reset_index(name='counts')[:5] sns.barplot(data=rys, x="release_year", y='counts') plt.xticks(rotation = 90) plt.title('Top 5 years most number of movies / TV shows are released') plt.show() Top 5 years most number of movies / TV shows are released 1000 800 counts 600 400 200 0 2016 2018 2019 2017 release_year Insights: Most number of movies and TV shows are released in 2018 In [194... | plt.figure(figsize=(5,10)) d1=df['release year'] sns.boxplot(data=d1) plt.xlabel('Movies / TV shows') plt.ylabel('release year') plt.xticks(rotation = 90) plt.title('Movies / TV shows release year') Movies / TV shows release year 2020 2000 1980 release year 1960 1940 Movies / TV shows Rating of movies and TV shows on Netflix In [195... plt.figure(figsize=(5,5)) rate=df['rating'].replace({'74 min':np.nan,'84 min':np.nan,'66 min':np.nan}).dropna().value counts().rename axi sns.barplot(data=rate, x="rating",y='counts') plt.xticks(rotation = 90) plt.title('Rating of movies / TV shows on Netflix') plt.show() Rating of movies / TV shows on Netflix 3000 2500 2000 1500 1000 500 0 TV-14 PG-13 TV-Y7 TV-PG Σź Ŗ 뜽 rating Insights: Most number of movies and TV shows on Netflix are rated as TV-MA **Recommendation**: Netflix should produce more TV-MA rated movies and TV shows. **Duration of movies** In [196... dm=df[df['type']=='Movie'] In [197... plt.figure(figsize=(10,5)) dur=dm["duration"].dropna().value_counts(ascending=False).rename_axis('duration').reset_index(name='counts')[:1 sns.barplot(data=dur, x="duration", y='counts') plt.xticks(rotation = 90) plt.title('Duration of movies') plt.show() Duration of movies 140 120 100 80 60 40 20 Ē Ē Ē Ē Ē Ē Ē Ē Ē Ē duration Insights: Most of movies have 90 minutes duration Recommendation: Netflix should produce movies having 90 minutes duration. **Duration of TV shows** ds=df[df['type']=='TV Show'] In [198.. In [199... plt.figure(figsize=(5,5)) dur=ds["duration"].dropna().value counts(ascending=False).rename axis('duration').reset index(name='counts')[:1 sns.barplot(data=dur, x="duration", y='counts') plt.xticks(rotation = 90) plt.title('Duration of movies') plt.show() Duration of movies 1750 1500 1250 counts 1000 750 500 250 0 Seasons 9 Seasons 10 Seasons 1 Season Seasons 3 Seasons duration **Insights**: Most number of TV shows have 1 season duration. **Recommendation**: Netflix should produce TV shows having 1 season duration. Pre-processing of the data (unnesting of the data in columns like director,cast ,country,listed_in) data=df.copy() In [200.. Unnesting "director" column df d=data.assign(director=data["director"].str.split(",")).explode("director") In [201. df d['director']=df d['director'].str.lstrip() In [202.. df_d['director'].dropna(inplace=True) df d In [204... Out[204]: title director listed_in description show_id type cast country date_added release_year rating duration As her Dick father nears Kirsten United September 0 NaN 2020 PG-13 90 min Documentaries the end of s1 Movie Johnson Is Johnson 25, 2021 States Dead his life, filmm... After Ama Qamata, International crossing Khosi Blood & TV TV Shows, TV paths at a South September Ngema, Gail Show Water Seasons Dramas, TV party, a Mabalane, Cape Town Mysteries Thaban... Crime TV To protect Sami Bouajila, Shows, his family Julien September 2 Tracy Gotoas, 2021 Ganglands NaN 1 Season International from a Leclercq Show MA 24, 2021 Samuel Jouy, TV Shows, TV powerful Nabi... Act... drug lor... Feuds, flirtations Jailbirds TV and toilet September Docuseries, 3 2021 New NaN NaN NaN 1 Season 24, 2021 Show Reality TV talk go Orleans down amo... Mayur More, In a city of International Jitendra coaching TV Shows, TV-2 TV Kota September 2021 NaN Kumar, India centers Show 24, 2021 Seasons Factory MA Romantic TV Ranjan Raj, known to Shows, TV ... Alam K... train I... Mark Ruffalo, A political Cult Movies, Jake cartoonist, United David November Dramas, 8802 s8803 Movie Zodiac Gyllenhaal, 2007 158 min a crime Fincher 20, 2019 States **Thrillers** Robert reporter Downey J... and a... While living Kids' TV, alone in a Zombie TV 2 Korean TV 8803 s8804 2018 TV-Y7 NaN NaN July 1, 2019 NaN spooky Show Dumb Seasons Shows, TV town, a Comedies young g... Jesse Eisenberg, Looking to Ruben Woody United November Comedies, survive in a 8804 s8805 2009 88 min Movie Zombieland Fleischer Harrelson, States 1, 2019 **Horror Movies** world taken Emma Stone, over by zo... Tim Allen, Dragged Children & Courteney from Peter United January 11, 8805 2006 PG s8806 Movie 88 min Family Movies, civilian life, Zoom Cox, Chevy 2020 Hewitt States Comedies a former Chase, Kate Ма... superhero... Vicky A scrappy Kaushal, Dramas, but poor Mozez Sarah-Jane March 2, International 8806 s8807 Movie Zubaan 2015 TV-14 111 min India boy worms 2019 Singh Dias, Movies, Music his way into & Musicals Raaghav a ty... Chanan... 9612 rows × 12 columns df d.shape In [205... (9612, 12) Out[205]: Top 5 directors with most number of movies / TV shows df d['director'].value counts().head() In [206... Rajiv Chilaka 22 Out[206]: Jan Suter Raúl Campos 19 Suhas Kadav 16 Marcus Raboy 16 Name: director, dtype: int64





