SCALER NETFLIX CASE STUDY: PROJECT LINK

(https://www.scaler.com/academy/mentee-dashboard/class/28625/project/problems/17748? navref=cl tt lst sl)

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EVALUATION CRITERIA AND POINTS:

- 1. Defining Problem Statement and Analysing basic metrics 10 Points
- 2. Observations on the shape of data, data types of all the attributes, conversion of categorical attributes to 'category' (If required), missing value detection, statistical summary 10 Points
- 3. Non-Graphical Analysis: Value counts and unique attributes 10 Points
- 4. Visual Analysis Univariate, Bivariate after pre-processing of the data

(Note: Pre-processing involves unnesting of the data in columns like Actor, Director, Country)

- 4.1 For continuous variable(s): Distplot, countplot, histogram for univariate analysis 10 Points
- 4.2 For categorical variable(s): Boxplot 10 Points
- 4.3 For correlation: Heatmaps, Pairplots 10 Points
- 5. Missing Value & Outlier check (Treatment optional) 10 Points
- 6.0 Insights based on Non-Graphical and Visual Analysis 10 Points
 - 6.1 Comments on the range of attributes
 - 6.2 Comments on the distribution of the variables and relationship between them
 - 6.3 Comments for each univariate and bivariate plot
- 7. Business Insights 10 Points Should include patterns observed in the data along with what you can infer from it
- 8 Recommendations 10 Points Actionable items for business. No technical jargon. No complications. Simple action items that everyone can understand.

In [1]:

```
# importing libraries
import pandas as pd
import numpy as np
import plotly

import matplotlib as mpl
import matplotlib.pyplot as plt

import seaborn as sns

plt.rcParams['figure.dpi'] = 200
```

C:\Users\iampr.MS\anaconda3\envs\google\lib\site-packages\scipy__init__.py:
146: UserWarning: A NumPy version >=1.16.5 and <1.23.0 is required for this
version of SciPy (detected version 1.23.0
 warnings.warn(f"A NumPy version >={np_minversion} and <{np_maxversion}"</pre>

In [2]:

```
df = pd.read_csv('netflix.csv')
df.head()
```

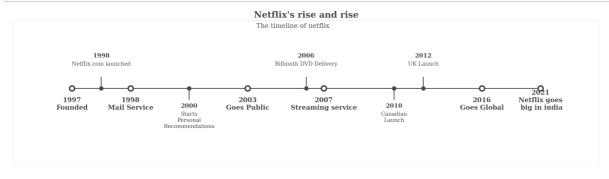
Out[2]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	(
0	s 1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	September 25, 2021	2020	PG- 13	
1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA	
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	NaN	September 24, 2021	2021	TV- MA	
3	s4	TV Show	Jailbirds New Orleans	NaN	NaN	NaN	September 24, 2021	2021	TV- MA	
4	s5	TV Show	Kota Factory	NaN	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	September 24, 2021	2021	TV- MA	

In [3]:

```
# @credit : taken information from internet
from datetime import datetime
## these go on the numbers below
tl_dates = [
    "1997\nFounded",
    "1998\nMail Service",
    "2003\nGoes Public",
    "2007\nStreaming service",
    "2016\nGoes Global",
    "2021\nNetflix goes\n big in india"
]
tl_x = [1, 2, 4, 5.3, 8, 9]
## these go on the numbers
tl\_sub\_x = [1.5,3,5,6.5,7]
tl\_sub\_times = [
    "1998", "2000", "2006", "2010", "2012"
tl_text = [
    "Netflix.com launched",
    "Starts\nPersonal\nRecommendations", "Billionth DVD Delivery", "Canadian\nLaunch", "UK Lau
# Set figure & Axes
fig, ax = plt.subplots(figsize=(15, 4), constrained_layout=True)
ax.set_ylim(-2, 1.75)
ax.set_xlim(0, 10)
# Timeline : line
ax.axhline(0, xmin=0.1, xmax=0.9, c='#4a4a4a', zorder=1)
# Timeline : Date Points
ax.scatter(tl x, np.zeros(len(tl x)), s=120, c='\#4a4a4a', zorder=2)
ax.scatter(tl_x, np.zeros(len(tl_x)), s=30, c='#fafafa', zorder=3)
# Timeline : Time Points
ax.scatter(tl_sub_x, np.zeros(len(tl_sub_x)), s=50, c='#4a4a4a',zorder=4)
# Date Text
for x, date in zip(tl_x, tl_dates):
    ax.text(x, -0.55, date, ha='center',
            fontfamily='serif', fontweight='bold',
            color='#4a4a4a', fontsize=12)
# Stemplot : vertical line
levels = np.zeros(len(tl sub x))
levels[::2] = 0.3
levels[1::2] = -0.3
markerline, stemline, baseline = ax.stem(tl_sub_x, levels, use_line_collection=True)
plt.setp(baseline, zorder=0)
plt.setp(markerline, marker=',', color='#4a4a4a')
```

```
plt.setp(stemline, color='#4a4a4a')
# Text
for idx, x, time, txt in zip(range(1, len(tl_sub_x)+1), tl_sub_x, tl_sub_times, tl_text):
    ax.text(x, 1.3*(idx%2)-0.5, time, ha='center',
            fontfamily='serif', fontweight='bold'
            color='#4a4a4a' if idx!=len(tl_sub_x) else '#4a4a4a', fontsize=11)
   ax.text(x, 1.3*(idx%2)-0.6, txt, va='top', ha='center',
        fontfamily='serif',color='#4a4a4a' if idx!=len(tl sub x) else '#4a4a4a')
# Spine
for spine in ["left", "top", "right", "bottom"]:
   ax.spines[spine].set visible(False)
# Ticks
ax.set_xticks([])
ax.set_yticks([])
# Title
ax.set_title("Netflix's rise and rise", fontweight="bold", fontfamily='serif', fontsize=16,
ax.text(2.4,1.57,"
                                                                    The timeline of netflix"
plt.show()
```



```
In [401]:
```

```
df=df.drop_duplicates(['title','country','type','release_year'])
```

1. Defining Problem Statement and Analysing basic metrics 10 Points

```
In [402]:
```

```
### NETFLIX IS A MULTI-NATIONAL STREAMING COMPANY WHICH PRODUCES
# MOVIES AND TV WEB SERIES ALL AROUND THE YEAR AND ALL AROUND THE GLOBE
# ANALYSING THE NETFLIX DATASET AND COMAPARING INDIA WITH DIFFERENT COUNTRIES AND
# TAKE CONCLUSION THROUGH VISUAL AND DESCRIPTIVE ANALYSIS
```

```
In [461]:
# shape of the data
df.shape
Out[461]:
(8807, 12)
In [ ]:
# the data frame has 8807 rows and 12 columns
In [404]:
#column names
df.columns # this are the columns of the netflux dataframe
Out[404]:
Index(['show_id', 'type', 'title', 'director', 'cast', 'country', 'date_adde
ď',
       'release_year', 'rating', 'duration', 'listed_in', 'description'],
      dtype='object')
In [405]:
# data type of all the attributes
types = []
for i in df.columns :
   types.append([i,type(i)])
for i in types:
   print("data type of",i[0], "is",i[1])
data type of show_id is <class 'str'>
data type of type is <class 'str'>
data type of title is <class 'str'>
data type of director is <class 'str'>
data type of cast is <class 'str'>
data type of country is <class 'str'>
data type of date added is <class 'str'>
data type of release_year is <class 'str'>
data type of rating is <class 'str'>
data type of duration is <class 'str'>
data type of listed_in is <class 'str'>
data type of description is <class 'str'>
In [462]:
```

the list of all the needed classes of the attribute

In [463]:

```
#INFO
df.info()
```

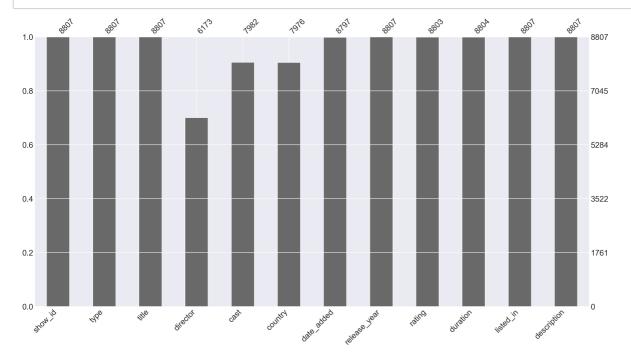
<class 'pandas.core.frame.DataFrame'> Int64Index: 8807 entries, 0 to 8806 Data columns (total 12 columns):

Data	COTUMNIS (COCA.	I IZ COIUIIIIS).	
#	Column	Non-Null Count	Dtype
0	show_id	8807 non-null	object
1	type	8807 non-null	object
2	title	8807 non-null	object
3	director	6173 non-null	object
4	cast	7983 non-null	object
5	country	7976 non-null	object
6	date_added	8797 non-null	<pre>datetime64[ns]</pre>
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
dtype	es: datetime64	[ns](1), int64(1), object(10)

memory usage: 1.1+ MB

In [407]:

```
#MISSING VALUES
msno.bar(df, figsize=(20,10))
plt.show()
```



In []:

shows the missing values in the columns

In [408]:

df.describe(include=[np.object]) #summary stats# give the statsistical summary of the objec

Out[408]:

	show_id	type	title	director	cast	country	date_added	rating	duration	
count	8807	8807	8807	6173	7982	7976	8797	8803	8804	
unique	8807	2	8807	4528	7692	748	1767	17	220	
top	s7442	Movie	In Line	Rajiv Chilaka	David Attenborough	United States	January 1, 2020	TV- MA	1 Season	ln
freq	1	6131	1	19	19	2818	109	3207	1793	
4										•

In [409]:

df.describe(include=[np.number]# give the statsistical summary of the numerical columns
#summary stats

Out[409]:

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

In [410]:

```
df.info()
```

<class 'pandas.core.frame.DataFrame'>
Int64Index: 8807 entries, 0 to 8806
Data columns (total 12 columns):

#	Column	Non-Null Count	Dtype
0	show_id	8807 non-null	object
1	type	8807 non-null	object
2	title	8807 non-null	object
3	director	6173 non-null	object
4	cast	7982 non-null	object
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: 894.5+ KB

In [411]:

df.head() # shows the head of the table

Out[411]:

	show_id	type	title	director	cast	country	date_added	release_year	rating
0	s 1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	September 25, 2021	2020	PG- 13
1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	TV- MA
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	NaN	September 24, 2021	2021	TV- MA
3	s4	TV Show	Jailbirds New Orleans	NaN	NaN	NaN	September 24, 2021	2021	TV- MA
4	s 5	TV Show	Kota Factory	NaN	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	September 24, 2021	2021	TV- MA

 $local host: 8888/notebooks/001_CS_NETFLIX/SCALERCS_01_NETFLIX.ipynb\#$

```
In [414]:
```

```
df['date added'] = pd.to datetime(df['date added'])
df.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 8807 entries, 0 to 8806
Data columns (total 12 columns):
                   Non-Null Count Dtype
#
     Column
                   -----
                                   object
 0
     show_id
                   8807 non-null
 1
     type
                   8807 non-null
                                   object
 2
     title
                   8807 non-null
                                   object
 3
     director
                   6173 non-null
                                   object
 4
     cast
                   7982 non-null
                                   object
 5
                  7976 non-null
     country
                                   object
                   8797 non-null
 6
    date_added
                                   datetime64[ns]
 7
     release_year 8807 non-null
                                   int64
 8
                   8803 non-null
                                   object
     rating
 9
     duration
                   8804 non-null
                                   object
   listed_in
                   8807 non-null
 10
                                   object
 11 description 8807 non-null
                                   object
dtypes: datetime64[ns](1), int64(1), object(10)
memory usage: 894.5+ KB
In [168]:
print(df.type.unique(),df.type.nunique())
['Movie' 'TV Show'] 2
In [207]:
for i in df.columns:
   print("The Unique values and nuniques of ",str(i),"are",df[i].unique(),df[i].nunique())
   print("....") # value counts and unique values of the columns
The Unique values and nuniques of show_id are ['s1' 's2' 's3' ... 's8805'
's8806' 's8807'] 8807
The Unique values and nuniques of type are ['Movie' 'TV Show'] 2
. . . . . . . . . . . . . . . . . . .
The Unique values and nuniques of title are ['Dick Johnson Is Dead' 'Bloo
d & Water' 'Ganglands' ... 'Zombieland'
 'Zoom' 'Zubaan'] 8807
. . . . . . . . . . . . . . . . . . .
The Unique values and nuniques of director are ['Kirsten Johnson' nan 'Ju
lien Leclercq' ... 'Majid Al Ansari'
 'Peter Hewitt' 'Mozez Singh'] 4528
The Unique values and nuniques of cast are [nan
 'Ama Qamata, Khosi Ngema, Gail Mabalane, Thabang Molaba, Dillon Windvoge
l, Natasha Thahane, Arno Greeff, Xolile Tshabalala, Getmore Sithole, Cindy
Mahlangu, Ryle De Morny, Greteli Fincham, Sello Maake Ka-Ncube, Odwa Gwany
a, Mekaila Mathys, Sandi Schultz, Duane Williams, Shamilla Miller, Patrick
Mofokeng'
```

In [191]:

```
df.columns
```

Out[191]:

In []:

```
# value counts
```

In [193]:

```
df['type'].value_counts().reset_index() # value count of type
```

Out[193]:

	index	type
0	Movie	6131
1	TV Show	2676

In [171]:

```
df['show_id'].value_counts().reset_index() # value count of show id
```

Out[171]:

	index	show_id
0	s7442	1
1	s8398	1
2	s1804	1
3	s7163	1
4	s4606	1
8802	s3810	1
8803	s7704	1
8804	s2988	1
8805	s2708	1
8806	s1879	1

In [194]:

```
df['title'].value_counts().reset_index() # value count of the title
```

Out[194]:

	index	title
0	In Line	1
1	Michael Bolton's Big, Sexy Valentine's Day Spe	1
2	Daybreak	1
3	Wrong No.	1
4	Unriddle	1
8802	Running Out Of Time	1
8803	The Light of My Eyes	1
8804	Jani Dueñas: Grandes fracasos de ayer y hoy	1
8805	Ghost Rider	1
8806	Kill the Irishman	1

8807 rows × 2 columns

In [195]:

df['director'].value_counts().reset_index() #value count of the director

Out[195]:

	index	director
0	Rajiv Chilaka	19
1	Raúl Campos, Jan Suter	18
2	Suhas Kadav	16
3	Marcus Raboy	16
4	Jay Karas	14
4523	Ashwiny Iyer Tiwari, Abhishek Chaubey, Saket C	1
4524	Jason Bourque	1
4525	Kader Aoun	1
4526	Hanung Bramantyo, Pandu Adjisurya	1
4527	Nathaniel Warsh	1

In [197]:

df['country'].value_counts().reset_index() #@value count of the country

Out[197]:

	index	country
0	United States	2818
1	India	972
2	United Kingdom	419
3	Japan	245
4	South Korea	199
743	India, Turkey	1
744	United Kingdom, Hong Kong	1
745	France, Senegal, Belgium	1
746	Finland	1
747	Netherlands, Germany, Italy, Canada	1

748 rows × 2 columns

In [198]:

df['date_added'].value_counts().reset_index()#value counts of the dat added column

Out[198]:

	index	date_added
0	January 1, 2020	109
1	November 1, 2019	89
2	March 1, 2018	75
3	December 31, 2019	74
4	October 1, 2018	71
1762	October 31, 2015	1
1763	November 29, 2020	1
1764	September 30, 2016	1
1765	February 3, 2019	1
1766	February 8, 2016	1

In [199]:

df['release_year'].value_counts().reset_index() # value count of the release year column

Out[199]:

	index	release_year
0	2018	1147
1	2017	1032
2	2019	1030
3	2020	953
4	2016	902
69	1966	1
70	1925	1
71	1947	1
72	1959	1
73	1961	1

In [201]:

```
df['rating'].value_counts().reset_index()
# value count of the rating column
```

Out[201]:

	index	rating
0	TV-MA	3207
1	TV-14	2160
2	TV-PG	863
3	R	799
4	PG-13	490
5	TV-Y7	334
6	TV-Y	307
7	PG	287
8	TV-G	220
9	NR	80
10	G	41
11	TV-Y7-FV	6
12	UR	3
13	NC-17	3
14	84 min	1
15	74 min	1
16	66 min	1

In [202]:

df['duration'].value_counts().reset_index() # value count of the duration

Out[202]:

	index	duration
0	1 Season	1793
1	2 Seasons	425
2	3 Seasons	199
3	90 min	152
4	93 min	146
215	17 Seasons	1
216	10 min	1
217	43 min	1
218	214 min	1
219	312 min	1

220 rows × 2 columns

In [203]:

df['listed_in'].value_counts().reset_index() # value count of the listenin column

Out[203]:

	index	listed_in
0	Dramas, International Movies	362
1	Documentaries	359
2	Stand-Up Comedy	334
3	Comedies, Dramas, International Movies	274
4	Dramas, Independent Movies, International Movies	252
509	Classic & Cult TV, Kids' TV, TV Action & Adven	1
510	Crime TV Shows, International TV Shows, Realit	1
511	Horror Movies, LGBTQ Movies, Music & Musicals	1
512	Reality TV, Science & Nature TV, TV Action & A	1
513	Comedies, LGBTQ Movies, Music & Musicals	1

In [204]:

df['description'].value_counts().reset_index() # value count of the description column

Out[204]:

	index	description
0	Paranormal activity at a lush, abandoned prope	4
1	Challenged to compose 100 songs before he can	3
2	A surly septuagenarian gets another chance at	3
3	Multiple women report their husbands as missin	3
4	An aspiring musician battles age-old caste div	2
8770	As World War I looms, an American nurse travel	1
8771	In 1921, nurse trainees from Madrid's upper cl	1
8772	After each of them loses a child to murder, tw	1
8773	With rare footage and candid interviews, this	1
8774	Twins separated by a court order meet at camp	1

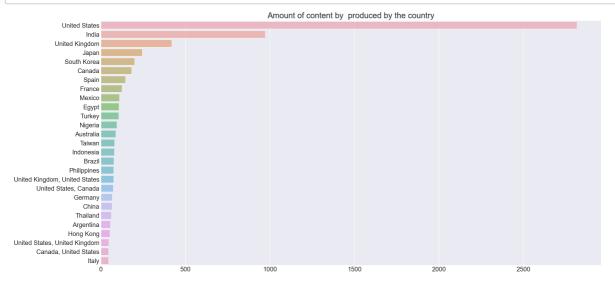
8775 rows × 2 columns

In [313]:

```
countries = df['country'].value_counts()[df['country'].value_counts(normalize=True)> 0.005]
list_countries = list(countries.index)
```

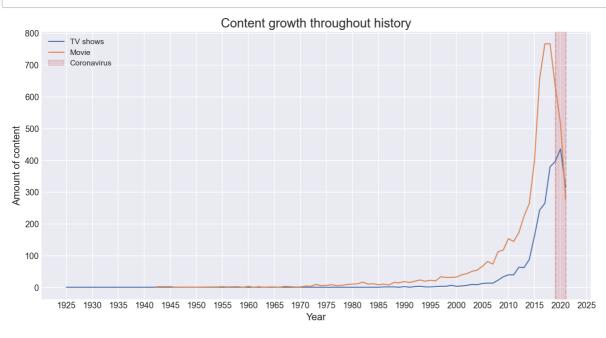
In [320]:

```
# barplotting the number of content per each country
plt.figure(figsize=(20,10))
plt.title('Amount of content by produced by the country', fontsize=18)
plt.tick_params(labelsize=14)
sns.barplot(y=countries.index, x=countries.values, alpha=0.6)
plt.show()
```



In [324]:

```
TVshows = df[df['type'] == 'TV Show']
Movie = df[df['type'] == 'Movie']
TVshows_progress = TVshows['release_year'].value_counts().sort_index()
Movie_progress = Movie['release_year'].value_counts().sort_index()
plt.figure(figsize=(14, 7))
plt.plot(TVshows_progress.index, TVshows_progress.values, label='TV shows')
plt.plot(Movie_progress.index, Movie_progress.values, label='Movie')
plt.axvline(2019, alpha=0.3, linestyle='--', color='r')
plt.axvline(2021, alpha=0.3, linestyle='--', color='r')
plt.axvspan(2019, 2021, alpha=0.2, color='r', label='Coronavirus')
plt.xticks(list(range(1925, 2026, 5)), fontsize=12)
plt.title('Content growth throughout history', fontsize=18)
plt.xlabel('Year', fontsize=14)
plt.ylabel('Amount of content', fontsize=14)
plt.yticks(fontsize=12)
plt.legend()
plt.show()
# shows that it has its peak at 2019 and corona virus pandamic has severly affected the con
```

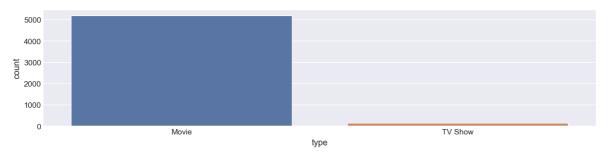


In [337]:

```
plt.figure(figsize=(14, 3))
sns.countplot(x='type',data = df)
#ratio of the movie / tv shows # there is a clear majority of movies released by netflix
```

Out[337]:

<AxesSubplot:xlabel='type', ylabel='count'>

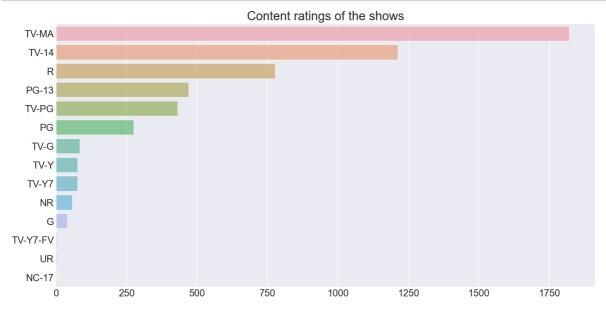


In [327]:

```
df.dropna(inplace=True)
rating = df['rating'].value_counts()

plt.figure(figsize=(14,7))
plt.title('Content ratings of the shows', fontsize=18)
plt.tick_params(labelsize=14)
sns.barplot(y=rating.index, x=rating.values, alpha=0.6)

plt.show() # most conetent is tv for matured audience and tv for 14 yrs
```

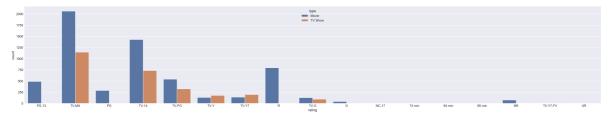


In [439]:

```
plt.figure(figsize = (35,6))
sns.countplot(x='rating',data = df,hue='type') # most shows and movuie wit matured audienc
```

Out[439]:

<AxesSubplot:xlabel='rating', ylabel='count'>



In [5]:

CONTENT RELEASE OVER THE YEAR

1200-			
1000			
800-			
600-			

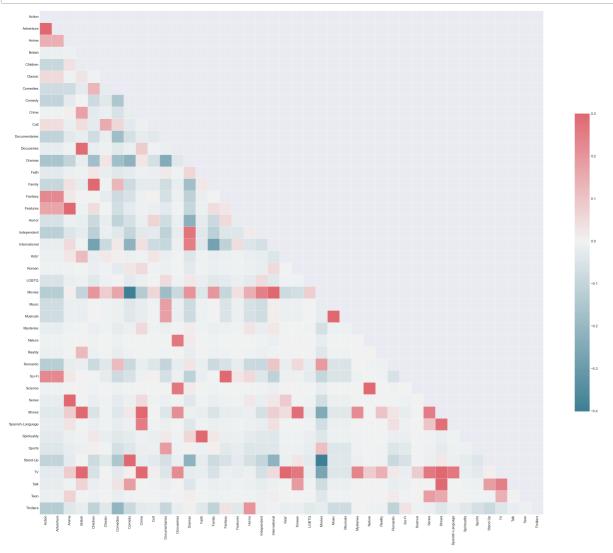
In [342]:

```
# bold('**HEATMAP(Correlation)**')
from sklearn.preprocessing import MultiLabelBinarizer # Similar to One-Hot Encoding

data= df['listed_in'].astype(str).apply(lambda s : s.replace('&',' ').replace(',', '').spl

test = data
    mlb = MultiLabelBinarizer()
    res = pd.DataFrame(mlb.fit_transform(test), columns=mlb.classes_)
    corr = res.corr()
    mask = np.zeros_like(corr, dtype=np.bool)
    mask[np.triu_indices_from(mask)] = True
    f, ax = plt.subplots(figsize=(35, 34))
    cmap = sns.diverging_palette(220, 10, as_cmap=True)
    sns.heatmap(corr, mask=mask, cmap=cmap, vmax=.3, center=0,square=True, linewidths=.5, cbar_plt.show()

# shows that international movies with target audience children are low
```

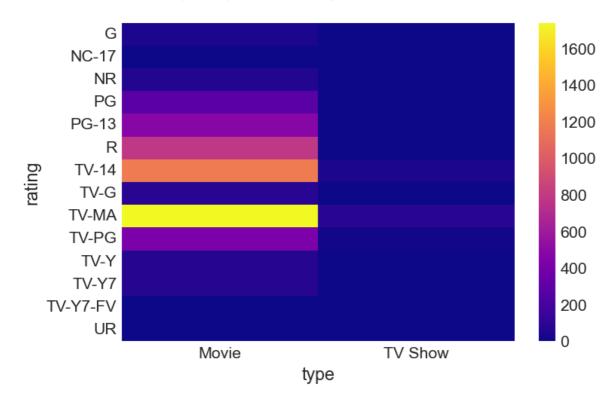


In [347]:

```
colormap = plt.cm.plasma
sns.heatmap(pd.crosstab(df["rating"], df["type"]), cmap = colormap)
```

Out[347]:

<AxesSubplot:xlabel='type', ylabel='rating'>



In [430]:

```
mf = df
mf =mf.drop(['show_id', 'title', 'director', 'cast', 'rating', 'duration', 'description',
mf.head()
```

Out[430]:

	type	country	date_added	release_year
0	Movie	United States	2021-09-25	2020
1	TV Show	South Africa	2021-09-24	2021
2	TV Show	NaN	2021-09-24	2021
3	TV Show	NaN	2021-09-24	2021
4	TV Show	India	2021-09-24	2021

In [429]:

mf.columns

Out[429]:

Index(['type', 'country', 'date_added', 'release_year'], dtype='object')

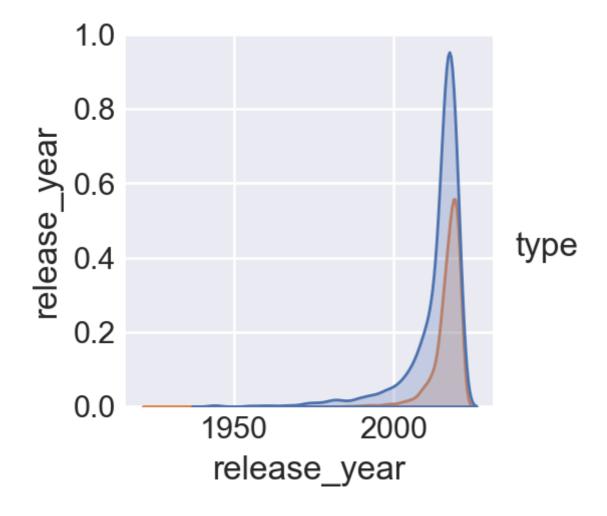
In [443]:

```
plt.figure(figsize = (35,6))
sns.pairplot(mf,hue='type') # pair plot of type and released year
```

Out[443]:

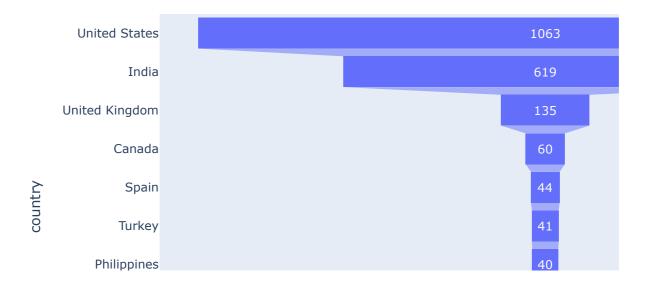
<seaborn.axisgrid.PairGrid at 0x15de13b9310>

<Figure size 7000x1200 with 0 Axes>



In [6]:

```
# plt.figure(figsize = (35,6))
df = pd.read_csv('netflix.csv')
import plotly.express as px
data = dict(    number=[1063,619,135,60,44,41,40,40,38,35],
    country=["United States", "India", "United Kingdom", "Canada", "Spain",'Turkey','Philip
fig = px.funnel(data, x='number', y='country')
fig.show()
```



In [481]:

most content produced by usa followed by india

```
In [436]:
```

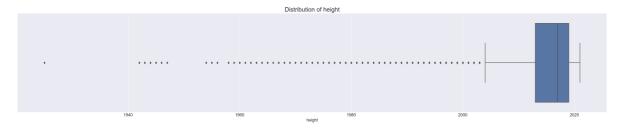
df.info()

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 8807 entries, 0 to 8806
Data columns (total 12 columns):
     Column
                   Non-Null Count Dtype
                   8807 non-null
0
     show_id
                                   object
 1
                   8807 non-null
                                   object
     type
 2
     title
                   8807 non-null
                                   object
 3
     director
                   6173 non-null
                                   object
 4
     cast
                   7982 non-null
                                    object
 5
     country
                   7976 non-null
                                   object
 6
     date_added
                   8797 non-null
                                   datetime64[ns]
 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
                   8807 non-null
                                    object
 11 description
dtypes: datetime64[ns](1), int64(1), object(10)
memory usage: 1.1+ MB
```

In [446]:

Out[446]:

Text(0.5, 1.0, 'Distribution of height')



In []:

there is a lot of historical content which is not prefered by modern audience

In []:

In [451]:

```
df['cast'].fillna(df['cast'].mode(), inplace = True) # replacing null values
```

In [465]:

Out[465]:

'Business insights:\n\n1 . The analsysis shows us that the there is high a mt of movies produced per year than tv shows\n2 . corona virus has the impacted the content quantity \n3 . the usa and india are the top 2 countries content wise\n4 . the content targeted in india is teens while the content being targeted at usa is adult audience\n5 . ck of child content produced in india \n6. india and south korean have similar taste and usa and uk audience have similar taste\n7.\n'

In []:

"""Recommendations:

- 1. produce more tv shows in high markets like india with diverse quantity
- 2. more movies targetting untapped young adult audience
- 3. more children quanity should be created """