Importing Libraries

df = pd.read_csv("netflix.csv")

df_cast=df_cast.stack()

df_cast

df_cast=pd.DataFrame(df_cast)
df_cast.reset_index(inplace=True)

df_cast=df_cast[['title',0]]
df_cast.columns=['title','cast']

temp_df=df['cast'].apply(lambda x: str(x).split(', ')).tolist()

df_cast=pd.DataFrame(temp_df,index=df['title'])

title cast

O Dick Johnson Is Dead nan

Blood & Water Ama Qamata

np.all(df_cast['title'].isin(df['title']))

True

DIOOU & Water ITTADATTY MICHADA

True

Merging df_cast and df dataframe as "data1"

	show_id	type	title	director	cast_x	country	date_added	release_year	ra
0	s 1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	September 25, 2021	2020	F
1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	T'
2	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	T'
					Ama				

Dropping unnecessary columns and renaming cast_y column to cast

```
data1.drop(['cast_x'],axis=1,inplace=True)
data1.rename(columns={'cast_y':'cast'},inplace=True)
data1.head()
```

dura	rating	release_year	date_added	country	director	title	type	show_id	
90	PG-13	2020	September 25, 2021	United States	Kirsten Johnson	Dick Johnson Is Dead	Movie	s 1	0
-	TV-MA	2021	September	South	NaN	Blood &	TV	s2	1

Unnesting Listed_in column

```
temp_df=df['listed_in'].apply(lambda x: str(x).split(', ')).tolist()
df_listed=pd.DataFrame(temp_df,index=df['title'])
df_listed=df_listed.stack()
df_listed=pd.DataFrame(df_listed)
df_listed.reset_index(inplace=True)
df_listed=df_listed[['title',0]]
df_listed.columns=['title','listed_in']
df_listed
```

	title	listed_in
0	Dick Johnson Is Dead	Documentaries
1	Blood & Water	International TV Shows
2	Blood & Water	TV Dramas
3	Blood & Water	TV Mysteries
4	Ganglands	Crime TV Shows
•••		
19318	Zoom	Children & Family Movies
19319	Zoom	Comedies
19320	Zubaan	Dramas
19321	Zubaan	International Movies
19322	Zubaan	Music & Musicals
10000	0 1	

19323 rows × 2 columns

True

```
np.all(df_listed['title'].isin(data1['title']))
```

Merging data1 and df_listed dataframe as "data2"

```
data2=data1.merge(df_listed,how="left",left_on="title",right_on="title")
data2.head()
```

	show_id	type	title	director	country	date_added	release_year	rating	dura
0	s 1	Movie	Dick Johnson Is Dead	Kirsten Johnson	United States	September 25, 2021	2020	PG-13	90
1	s2	TV Show	Blood & Water	NaN	South Africa	September 24, 2021	2021	TV-MA	Sea
2	s 2	TV Show	Blood & Water	NaN	South Africa	September 24, 2021	2021	TV-MA	Sea
3	s2	TV Show	Blood & Water	NaN	South Africa	September 24, 2021	2021	TV-MA	Sea

Dropping unnecessary columns and renaming listed_in_y column to genre

```
data2.drop(['listed_in_x'],axis=1,inplace=True)
data2.rename(columns={'listed_in_y':'genre'},inplace=True)
data2.head()
```

	show_id	type	title	director	country	date_added	release_year	rating	dura
0	s 1	Movie	Dick Johnson Is Dead	Kirsten Johnson	United States	September 25, 2021	2020	PG-13	90
1	s2	TV Show	Blood & Water	NaN	South Africa	September 24, 2021	2021	TV-MA	Sea
2	s2	TV Show	Blood & Water	NaN	South Africa	September 24, 2021	2021	TV-MA	Sea

Unnesting country column

```
temp_df=df['country'].apply(lambda x: str(x).split(', ')).tolist()
df_country=pd.DataFrame(temp_df,index=df['title'])
df_country=df_country.stack()
df_country=d_DataFrame(df_country)
```

```
di_country-pu.bacarrame(ui_country)
df_country.reset_index(inplace=True)
df_country=df_country[['title',0]]
df_country.columns=['title','country']
df_country
```

	title	country
0	Dick Johnson Is Dead	United States
1	Blood & Water	South Africa
2	Ganglands	nan
3	Jailbirds New Orleans	nan
4	Kota Factory	India
•••		
10840	Zodiac	United States
10841	Zombie Dumb	nan
10842	Zombieland	United States
10843	Zoom	United States
10844	Zubaan	India

10845 rows × 2 columns

Merging data2 and df_country data frame as "data3"

```
data3=data2.merge(df_country,how="left",left_on="title",right_on="title")
data3.head()
```

show_id type title director country_x date_added release_year rating du

Dropping unneccesary columns and renaming country_y to country

	show_id	type	title	director	date_added	release_year	rating	duration	des
0	s 1	Movie	Dick Johnson Is Dead	Kirsten Johnson	September 25, 2021	2020	PG-13	90 min	As nea
1	s2	TV Show	Blood & Water	NaN	September 24, 2021	2021	TV-MA	2 Seasons	par
2	s2	TV Show	Blood & Water	NaN	September 24, 2021	2021	TV-MA	2 Seasons	par

Unnesting director column

```
temp_df=data3['director'].apply(lambda x: str(x).split(', ')).tolist()
df_director=pd.DataFrame(temp_df,index=data3['title'])
df_director=df_director.stack()
df_director=pd.DataFrame(df_director)
df_director.reset_index(inplace=True)
df_director=df_director[['title',0]]
df_director.columns=['title','director']
df_director
```

		title	director
	0	Dick Johnson Is Dead	Kirsten Johnson
	1	Blood & Water	nan
	2	Blood & Water	nan
np.al	l(df_dir	rector['title'].isin	(data3['title']))
	True		
	•••		

Merging data3 and df_director dataframe as "netflix_df"

d	duration	rating	release_year	date_added	director_x	title	type	show_id	
<i>I</i> n	90 min	PG-13	2020	September 25, 2021	Kirsten Johnson	Dick Johnson Is Dead	Movie	s1	0
ţ	2 Seasons	TV-MA	2021	September 24, 2021	NaN	Blood & Water	TV Show	s2	1
ţ	2 Seasons	TV-MA	2021	September 24, 2021	NaN	Blood & Water	TV Show	s2	2

Dropping unneccesary columns and replacing director_y to director

```
netflix_df.drop(['director_x'],axis=1,inplace=True)
netflix_df.rename(columns={'director_y':'director'},inplace=True)
netflix_df.head()
```

	show	_id	type	e ti	tle	date_added	release_year	rating	duration	description
	0	s1	Movie	e John	Dick son ead	September 25, 2021	2020	PG-13	90 min	As her father nears the end of his life, filmm
Chec	king for	dupl	icate r	ows						
	1	s2		ייי טוט יי	u u	ochreninei - · · · · ·	2021	TV-MA	_	naths at a
netfl	.ix_df.du	uplic	ated()						
	0	F	alse							
	1	F	alse							
	2		True							
	3		True							
	4		True							
	8417142		True							
	8417143		True							
	8417144		True							
	8417145		True							
	8417146		True							
	Length:	8417	7147,	dtype:	bool					

Deleting duplicate rows

```
netflix_df = netflix_df.drop_duplicates()
np.any(netflix_df.duplicated())
```

False

Rearranging columns

```
netflix_df = netflix_df[["title","genre","type","director","date_added","release_year","ra
netflix_df.head()
```

title genre type director date_added release_year rating durati Missing value

0 Johnson Documentaries Movie 25 2021 2020 PG-13 90 r netflix_df.isna().head()

		title	genre	type	director	date_added	release_year	rating	duration	cast
	0	False	False	False	False	False	False	False	False	False
	1	False	False	False	False	False	False	False	False	False
į	58	False	False	False	False	False	False	False	False	False
1	15	False	False	False	False	False	False	False	False	False
1	72	False	False	False	False	False	False	False	False	False

netflix_df.isna().sum()

title	0
genre	0
type	0
director	0
date_added	158
release_year	0
rating	67
duration	3
cast	0
country	0
description	0
dtype: int64	

Replacing null with zero for numerical data

netflix_df.fillna(0)

		title	genre	type	director	date_added	release_year	rating	dι
	0	Dick Johnson Is Dead	Documentaries	Movie	Kirsten Johnson	September 25, 2021	2020	PG-13	
	1	Blood & Water	International TV Shows	TV Show	nan	September 24, 2021	2021	TV-MA	:
	58	Blood & Water	TV Dramas	TV Show	nan	September 24, 2021	2021	TV-MA	:
Repla	cing null	values for	column with dt	ype - 'ol	oject'				
-	115	\\/a+a=	IV Mysteries	Chau	nan	04 0001	2021	I V-MA	4
netfl	ix_df[['r	rating','d	uration']].fil	lna('-')				

	rating	duration	
0	PG-13	90 min	
1	TV-MA	2 Seasons	
58	TV-MA	2 Seasons	
115	TV-MA	2 Seasons	
172	TV-MA	2 Seasons	
•••	•••		
8417027	TV-14	111 min	
8417051	TV-14	111 min	
8417075	TV-14	111 min	
8417099	TV-14	111 min	
8417123	TV-14	111 min	

201936 rows × 2 columns

```
netflix_df["date_added"] = pd.to_datetime(df["date_added"])
mean_date = netflix_df['date_added'].astype(int).mean().astype('datetime64[ns]')
netflix_df['date_added'].fillna(mean_date, inplace=True)
```

<ipython-input-108-388c2d970cf1>:2: FutureWarning: casting datetime64[ns] values to i
 mean_date = netflix_df['date_added'].astype(int).mean().astype('datetime64[ns]')

```
netflix_df['rating'].fillna('',inplace=True)
netflix_df['duration'].fillna('',inplace=True)
netflix_df.isnull().sum()
    title
    genre
                   0
    type
    director
    date_added
    release_year 0
    rating
    duration
                  0
    cast
    country
    description
    dtype: int64
```

Problem Statement and Analysing basic metrics

- ==> Identify business insights and make recommendations to improve Netflix's business by understanding Netflix content over the years.
- ==> Basic metrics here can be like finding countries with more content, identifying if a country puts emphasis on TV shows or movies etc.

```
# checking first 5 rows
netflix_df.head(5)
```

	title	genre	type	director	date_added	release_year	rating	durati
0	Dick Johnson Is Dead	Documentaries	Movie	Kirsten Johnson	2021-09-25	2020	PG-13	90 r
1	Blood & Water	International TV Shows	TV Show	nan	2021-09-24	2021	TV-MA	Seasc
58	Blood & Water	TV Dramas	TV Show	nan	2021-09-15	2021	TV-MA	Seasc

type(netflix_df)

pandas.core.frame.DataFrame

```
netflix_df.dtypes
      title
                                   object
                                   object
      genre
      type
                                   object
      director
                                   object
      date_added datetime64[ns]
      release_year
                                  int64
                                   object
      rating
      duration
                                   object
      cast
                                   object
      country
                                   object
      description
                                   object
      dtype: object
netflix_df.shape
      (201936, 11)
netflix_df.columns
      Index(['title', 'genre', 'type', 'director', 'date_added', 'release_year',
               'rating', 'duration', 'cast', 'country', 'description'],
             dtype='object')
netflix_df.info()
      <class 'pandas.core.frame.DataFrame'>
      Int64Index: 201936 entries, 0 to 8417123
      Data columns (total 11 columns):
       # Column Non-Null Count Dtype
                          201936 non-null object
      --- ----
       0 title
       1 genre 201936 non-null object
2 type 201936 non-null object
3 director 201936 non-null object
4 date_added 201936 non-null datetime64[ns]
       5 release_year 201936 non-null int64
6 rating 201936 non-null object
7 duration 201936 non-null object
8 cast 201936 non-null object
       9 country 201936 non-null object
10 description 201936 non-null object
      dtypes: datetime64[ns](1), int64(1), object(9)
      memory usage: 18.5+ MB
```

netflix df.describe()



count 201936.000000

mean 2013.452277

std 9.003761

min 1925.000000

netflix_df.describe(include="all")

<ipython-input-113-51f2f71230af>:1: FutureWarning: Treating datetime data as categori
netflix_df.describe(include="all")

	title	genre	type	director	date_added	release_year	rating	d
count	201936	201936	201936	201936	201936	201936.000000	201936	
unique	8807	42	2	4994	174	NaN	18	
top	Kahlil Gibran's The Prophet	Dramas	Movie	nan	1678-01-17 15:00:19.229707264	NaN	TV-MA	1
freq	700	29756	145788	50643	201744	NaN	73819	
first	NaN	NaN	NaN	NaN	1678-01-17 15:00:19.229707264	NaN	NaN	
last	NaN	NaN	NaN	NaN	2021-09-25 00:00:00	NaN	NaN	
mean	NaN	NaN	NaN	NaN	NaN	2013.452277	NaN	
std	NaN	NaN	NaN	NaN	NaN	9.003761	NaN	
min	NaN	NaN	NaN	NaN	NaN	1925.000000	NaN	
25%	NaN	NaN	NaN	NaN	NaN	2012.000000	NaN	
50%	NaN	NaN	NaN	NaN	NaN	2016.000000	NaN	
75%	NaN	NaN	NaN	NaN	NaN	2019.000000	NaN	
max	NaN	NaN	NaN	NaN	NaN	2021.000000	NaN	

+_+

netflix_df["director"].value_counts()

nan Martin Scorsese Youssef Chahine Cathy Garcia-Molina	50643 419 409 356
Steven Spielberg	355
Richard Maurice	1
Richard E. Norman	1
Spencer Williams	1
Oscar Micheaux	1

Kirsten Johnson 1

Name: director, Length: 4994, dtype: int64

netflix_df.sort_values(by="release_year").head()

		title	genre	type	director	date_added	release_year
		Pioneers: First Women Filmmakers*	TV Shows	TV Show	nan	1678-01-17 15:00:19.229707264	1925
	7771206	The Battle of Midway	Documentaries	Movie	John Ford	1678-01-17 15:00:19.229707264	1942
	7771202	The Battle of Midway	Classic Movies	Movie	John Ford	1678-01-17 15:00:19.229707264	1942
netf]	lix_df.isnu	ll().sum()					
	title genre type director date_added release_yes rating duration cast country description dtype: into	ar 0 0 0 0 0 0					

Observations on dataframe

shape of data

data types of all the attributes

netflix_df.info() # Apart from release year, all other columns are of type 'object'

missing value detection

netflix_df.isna().sum(axis = 0) # No null values as we have replaced them earlier.

```
title
            0
genre
            0
type
director
date_added 0
release_year 0
rating
duration
           0
           0
cast
country
description 0
dtype: int64
```

statistical summary

netflix_df.describe() # Retuns data for columns which are not type of bool/object. Let us



df.describe(include="all")

	show_id	type	title	director	cast	country	date_added	release_y
count	8807	8807	8807	6173	7982	7976	8797	8807.000
unique	8807	2	8807	4528	7692	748	1767	
top	s 1	Movie	Dick Johnson Is Dead	Rajiv Chilaka	David Attenborough	United States	January 1, 2020	
freq	1	6131	1	19	19	2818	109	
mean	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2014.18(
std	NaN	NaN	NaN	NaN	NaN	NaN	NaN	8.819
min	NaN	NaN	NaN	NaN	NaN	NaN	NaN	1925.00(
25%	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2013.000
50%	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2017.000
75%	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2019.000
max	NaN	NaN	NaN	NaN	NaN	NaN	NaN	2021.000

categorical attributes - In the given data set, there are some categorical values. Let us find some insights on them.

2016 18465

Name: release_year, dtype: int64

Column Name: director

nan 50643
Martin Scorsese 419
Youssef Chahine 409
Cathy Garcia-Molina 356
Steven Spielberg 355
Name: director, dtype: int64

Column Name: cast

nan 2146
Liam Neeson 161
Alfred Molina 160
John Krasinski 139
Salma Hayek 130
Name: cast, dtype: int64

Column Name: country

United States 59324
India 22814
United Kingdom 12945
nan 11897
Japan 8679
Name: country, dtype: int64

3. Non-Graphical Analysis

```
netflix_df["release_year"].nunique()
```

74

pd.value_counts(netflix_df["release_year"])

Name: release_year, Length: 74, dtype: int64

netflix_df[netflix_df['type']=='TV Show']['duration'].unique()

```
array(['2 Seasons', '1 Season', '9 Seasons', '4 Seasons', '5 Seasons', '3 Seasons', '6 Seasons', '7 Seasons', '10 Seasons', '8 Seasons', '17 Seasons', '13 Seasons', '15 Seasons', '12 Seasons',
                 '11 Seasons'], dtype=object)
df["director"].value_counts()
       Rajiv Chilaka
                                                       19
       Raúl Campos, Jan Suter
                                                       18
       Marcus Raboy
                                                       16
       Suhas Kadav
                                                        16
       Jay Karas
                                                        14
       Raymie Muzquiz, Stu Livingston
                                                        1
       Joe Menendez
```

1

1

Mozez Singh 1 Name: director, Length: 4528, dtype: int64

4. Visual Analysis

Eric Bross

Will Eisenberg

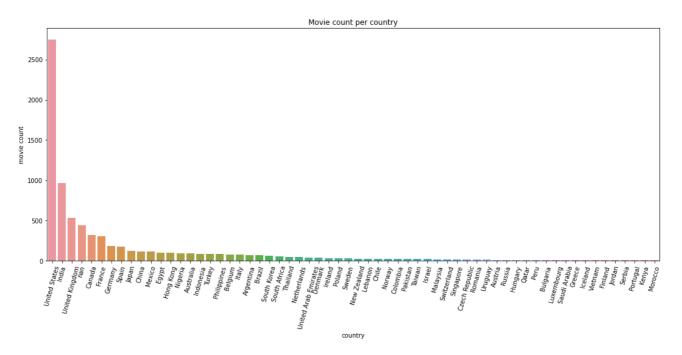
genre_count = netflix_df[['title','country','type']].drop_duplicates().groupby(by=['country', 'type']].drop_duplicates().groupby(by=['country', 'type']].drop_duplicates().groupby(by=['country

	country	type	title	1
177	United States	Movie	2751	
68	India	Movie	962	
178	United States	TV Show	938	
174	United Kingdom	Movie	532	
188	nan	Movie	440	
65	Hungary	TV Show	1	
155	Sri Lanka	Movie	1	
156	Sudan	Movie	1	
123	Panama	Movie	1	
0		Movie	1	

190 rows × 3 columns

Movies count unique to country > 5

```
plt.figure(figsize=(18,7))
plt.title('Movie count per country')
sns.barplot(x='country',y='title',data=genre_count[(genre_count['type']=='Movie')&(genre_c
plt.xticks(rotation=75)
plt.ylabel('movie count')
plt.show()
```



▼ TV shows based on country > 5

```
plt.figure(figsize=(18,7))
plt.title('Show count per Country')
sns.barplot(x='country',y='title',data=genre_count[(genre_count['type']=='TV Show')&(genre_plt.ylabel('tv show count')
plt.xticks(rotation=75)
plt.show()
```



Mexico Olina - Cermany - Colombia - Brazil - Brazil - Brazil - Agentina - Agentina - Egypt - Ireland - Couth Africa - Israel - South Africa - Israel - Sweden - Norway - Poland - Norway - Poland - Majaysia - Lebanon - Czech Republic - Czech Repu

release_yr_cnt = netflix_df[['title','release_year','type']].drop_duplicates().groupby(by=
release_yr_cnt

	release_year	type	title	1
0	1925	TV Show	1	
1	1942	Movie	2	
2	1943	Movie	3	
3	1944	Movie	3	
4	1945	Movie	3	
•••				
114	2019	TV Show	397	
115	2020	Movie	517	
116	2020	TV Show	436	
117	2021	Movie	277	
118	2021	TV Show	315	

119 rows × 3 columns

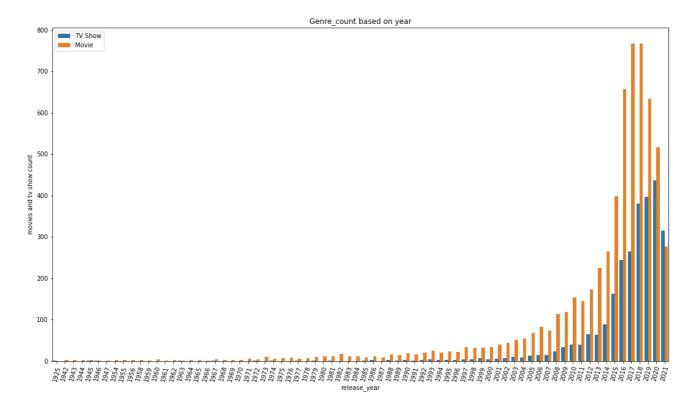
800

600

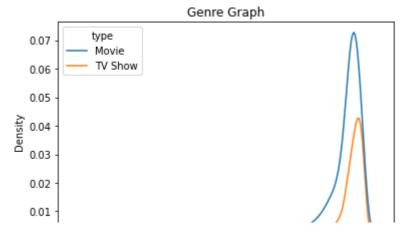
200

→ Genre_count based on year

```
plt.figure(figsize=(18,10))
plt.title('Genre_count based on year')
sns.barplot(x='release_year',y='title',data=release_yr_cnt,hue='type')
plt.ylabel('movies and tv show count')
plt.xticks(rotation=75)
plt.legend(loc='upper left')
plt.show()
```



```
plt.title('Genre Graph')
sns.kdeplot(data=df,x='release_year',hue='type')
plt.show()
```



rating_count

	country	rating	type	title
0		TV-14	Movie	1
1		TV-MA	TV Show	1
2	Afghanistan	TV-MA	Movie	1
3	Albania	TV-MA	Movie	1
4	Algeria	TV-14	Movie	1
•••				
691	nan	TV-Y	Movie	47
692	nan	TV-Y	TV Show	33
693	nan	TV-Y7	Movie	56
694	nan	TV-Y7	TV Show	42
695	nan	TV-Y7-FV	Movie	1

696 rows × 4 columns

rating_count[rating_count.country=='South Korea']

	country	rating	type	title	
524	South Korea	G	Movie	1	
525	South Korea	NR	Movie	4	
526	South Korea	PG	Movie	2	
527	South Korea	PG-13	Movie	1	
528	South Korea	R	Movie	2	
529	South Korea	TV-14	Movie	4	
530	South Korea	TV-14	TV Show	82	
531	South Korea	TV-G	TV Show	1	
532	South Korea	TV-MA	Movie	37	
ing_cou	unt.sort_valu	ies(by=['title','	country'],ascending=[False,True],inpla

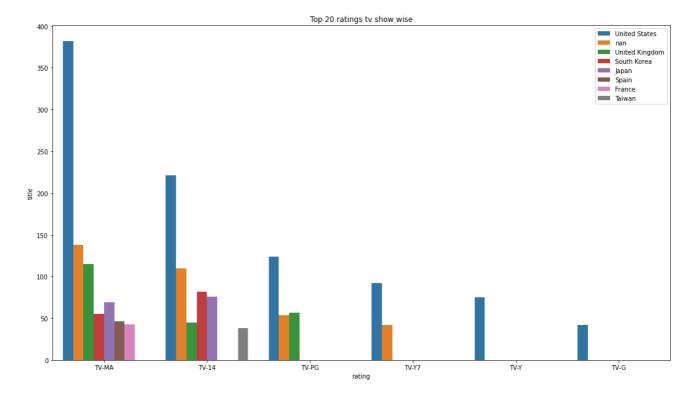
▼ Top20 ratings for movies

```
plt.figure(figsize=(18,10))
plt.title('Top 20 ratings for movies')
sns.barplot(x='rating',y='title',data=rating_count[rating_count['type']=='Movie'].head(20)
plt.legend(loc='upper right')
plt.show()
```



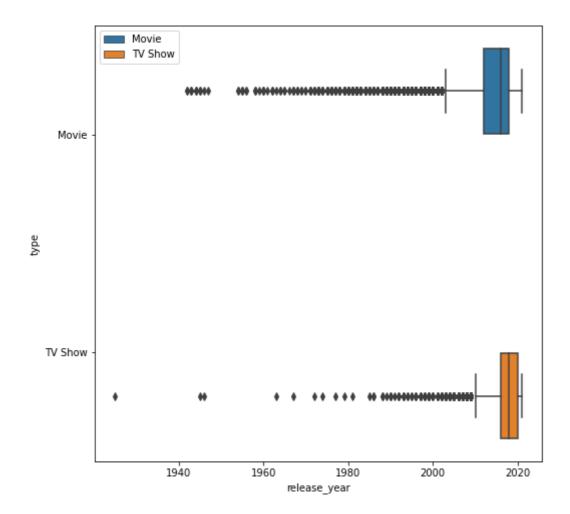
▼ Top 20 TV shows

```
plt.figure(figsize=(18,10))
plt.title('Top 20 ratings for shows')
sns.barplot(x='rating',y='title',data=rating_count[rating_count['type']=='TV Show'].head(2
plt.legend(loc='upper right')
plt.show()
```



```
plt.figure(figsize=(8,8))
sns.boxplot(data=df,x='release_year',y='type',hue='type')
plt.legend(loc='upper left')
```

plt.show()



Insights based on Non-Graphical and Visual Analysis

Non-Graphical Analysis Insights

- ==> The data given indicates Netflix has more movies when compared with TV shows
- ==> The data is also incorrect for the duration field because it cannot be null. The field values for 3 rows are swapped with the wrong column and the 3 rows are for the same cast and director which indicates faulty data
- ==> The cast and director and country are unknown in some cases which can hinder further analysis
- ==> The date_added field also has null values and it should not be possible because the field indicates when content has been added to Netflix.

Graphical Analysis Insights

==> From the plot with the title 'Movie count per country' we can see that USA is number one followed by India. There are few countries which have less than 5 movies which is not good

- ==> From the plot with the title 'Show count per country' we can see that USA is number one followed by Unknown[None] where as India is at 8th position. This can indicate 2 things either Indians like to watch more movies or the majority TV shows content available in India is being sold to some other OTT services.
- ==> From the plot with the title 'Genre_count based on year' we can see that the movie and TV show trend was growing though there is a reduction in 2021. This can be due to external reasons like the absence of Covid in the dataset
- ==> It is clear from the plot with the title 'Top 20 ratings for movies' that USA telecasts a majority type of movie, whereas R-rated movies aren't telecast as often because there are fewer of them in other nations.
- ==> From the plot with the title 'Top 20 ratings for shows' we can see that USA telecasts the majority kind and UK and south korea. We can also see South Korea put more emphasis on TV shows when compared to movies.

Business Insights

- ==> Majority of the netflix content is available for USA and UK and Canada so netflix should make sure they keep adding content in those regions more
- ==> South korea has more emphasis over TV shows which is good and netflix should keep on supporting them since netflix has less TV shows when compared with movies

Recommendations

- ==> To improve tv show content over netflix a research need to be done in respective countries where movie content is really good but the tv show content is not good to find out the other vendors who host the tv show content and take action accordingly
- ==> Netflix should also focus on its reach to other countries from where the content is too low