

Netflix:

Netflix is an American subscription video-on-demand over-the-top streaming service. The service primarily distributes original and acquired films and television shows from various genres, and it is available internationally in multiple languages. Launched on January 16, 2007, nearly a decade after Netflix, Inc. began its DVD-by-mail service, Netflix is the most-subscribed video-on-demand streaming media service, with 238.39 million paid memberships in more than 190 countries. By 2022, original productions accounted for half of its library in the United States and the namesake company had ventured into other categories, such as video game publishing via its eponymous service. company headquartered in Los Gatos, California. Netflix was founded in 1997 by Reed Hastings and Marc Randolph in Scotts Valley, California. The company’s primary business is its subscrip on-based streaming service, which offers online streaming of a library of films and television series, including those produced in-house.

```
import numpy as np
import pandas as pd
import seaborn as sns
import matplotlib.pyplot as plt
```

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

```
df.head(5)
```

	show_id	type	title	director	cast	country	date_added	release_year	rat
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	September 25, 2021	2020	PG
1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...	South Africa	September 24, 2021	2021	TV-
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy	NaN	September 24, 2021	2021	TV-

```
df.info()
```

```
<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   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: 825.8+ KB
```

```
df.describe()
```

	release_year
count	8807.000000
mean	2014.180198
std	8.819312
min	1925.000000
25%	2013.000000

```
df.shape
```

```
(8807, 12)
```

```
max 2021.000000
```

There are 88807 rows and 12 columns in the netflix file

```
df.isnull().sum()
```

```
show_id      0
type         0
title        0
director    2634
cast         825
country      831
date_added   10
release_year  0
rating       4
duration     3
listed_in    0
description  0
dtype: int64
```

```
df.isnull().sum()/len(df)*100
```

```
show_id      0.000000
type         0.000000
title        0.000000
director    29.908028
cast         9.367549
country      9.435676
date_added   0.113546
release_year  0.000000
rating       0.045418
duration     0.034064
listed_in    0.000000
description  0.000000
dtype: float64
```

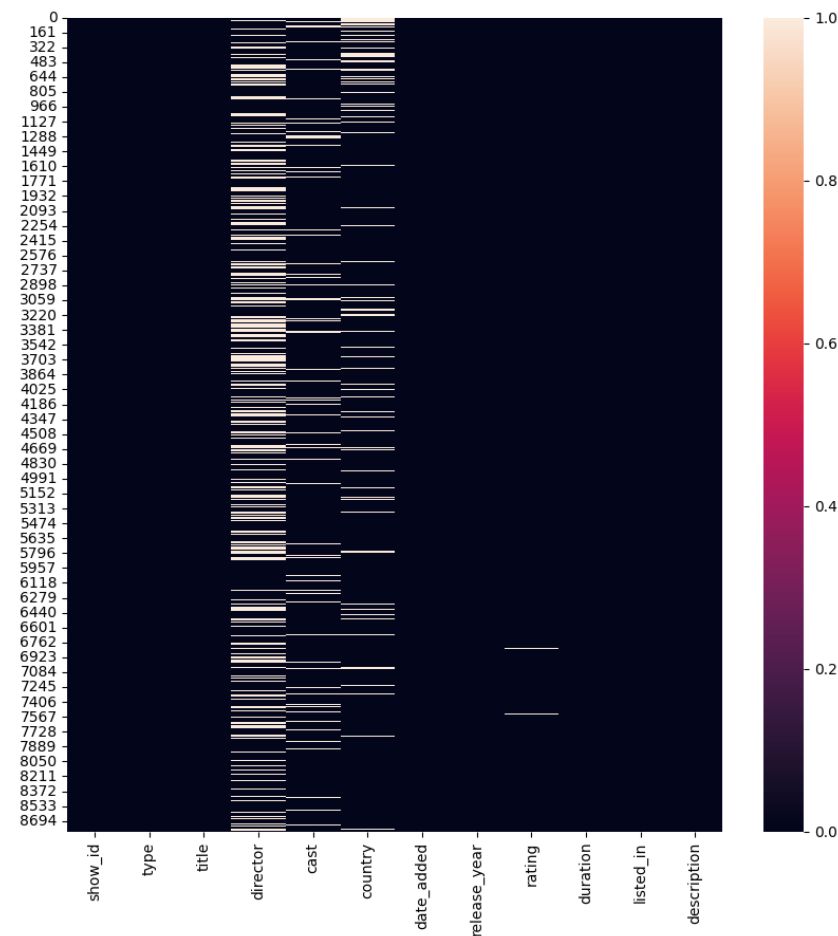
```
df.isnull().sum().plot(kind='bar')
```

<Axes: >

As we can see there are more null values in director column, followed by cast and country columns. There are a few null values in date_added, rating, duration.

```
plt.figure(figsize=[10,10])
sns.heatmap(df.isnull())
```

<Axes: >



The same can be seen in the heatmap.

```
df['Date']=pd.to_datetime(df['date_added'])#converting date_added to datetime type to do the analysis
df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 8807 entries, 0 to 8806
Data columns (total 13 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
12 Date       8797 non-null datetime64[ns]
dtypes: datetime64[ns](1), int64(1), object(11)
memory usage: 894.6+ KB

```

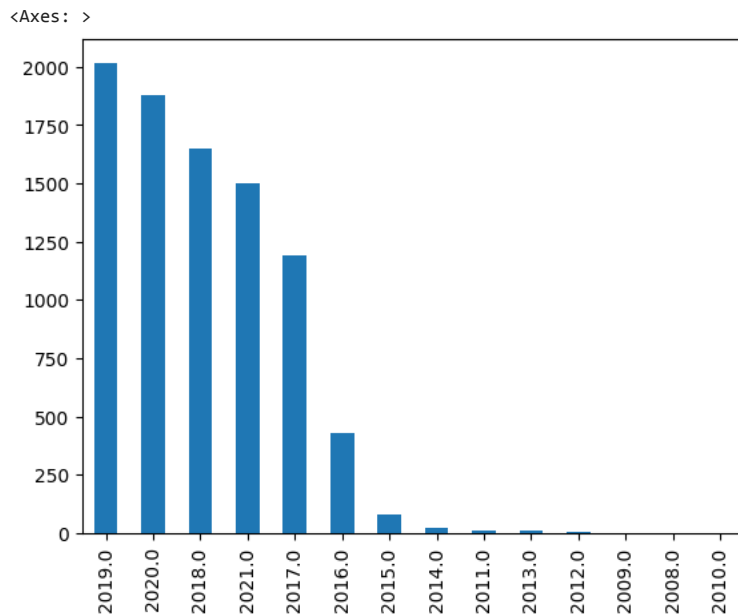
```
df['Date'].dt.year.value_counts().astype('int64')
```

```

2019.0    2016
2020.0    1879
2018.0    1649
2021.0    1498
2017.0    1188
2016.0     429
2015.0      82
2014.0      24
2011.0      13
2013.0      11
2012.0       3
2009.0       2
2008.0       2
2010.0       1
Name: Date, dtype: int64

```

```
df['Date'].dt.year.value_counts().plot(kind='bar')
```



1. The highest number of contents were added to Netflix in the year 2019.
2. More contents are added from 2016-2021 when compared to 2008-2015.

```
df['Date'].dt.year.aggregate(['max', 'min'])
```

```

max    2021.0
min    2008.0
Name: Date, dtype: float64

```

We have the data for movies and tv shows added to netflix from the year 2008 to the year 2021

```
df['type'].value_counts()
```

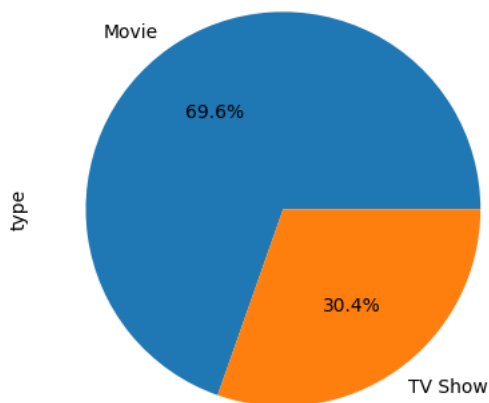
```

Movie      6131
TV Show    2676
Name: type, dtype: int64

```

```
df['type'].value_counts().plot(kind='pie', autopct='%1.1f%%')
```

<Axes: ylabel='type'>



There are more movies than tv shows.

✓ Steps to be performed

1. fill nulls
2. unnest director, cast, country, listed_in.
3. set duration, date

```
data = df
```

✓ 1. Filling nulls with unk(unknown) Or -1

```
data['director'].fillna('unk_dir', inplace = True)
data['cast'].fillna('unk_cast', inplace = True)
data['country'].fillna('unk_country', inplace = True)
data['rating'].fillna('unk_rating', inplace = True)
data['duration'].fillna('-1 min', inplace = True)
```

```
data.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 8807 entries, 0 to 8806
Data columns (total 13 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        8807 non-null   object
4   cast            8807 non-null   object
5   country         8807 non-null   object
6   date_added      8797 non-null   object
7   release_year    8807 non-null   int64
8   rating          8807 non-null   object
9   duration        8807 non-null   object
10  listed_in       8807 non-null   object
11  description      8807 non-null   object
12  Date            8797 non-null   datetime64[ns]
dtypes: datetime64[ns](1), int64(1), object(11)
memory usage: 894.6+ KB
```

The movies and tv shows released from the year 1925 to 2021 are there in the data given.

```
data.describe(include='object')
```

```

    show_id  type  title  director    cast  country  date_added  rating  du
count      8807  8807    8807      8807    8807    8807      8797    8807
unique      8807     2    8807    4529    7693     749      1767     18

top      s1  Movie  Dick Johnson  unk_dir  unk_cast  United States  January 1, 2020  TV-MA  1
data['type'].value_counts(normalize=True)*100
Movie      69.615079
TV Show    30.384921
Name: type, dtype: float64

```

data.head()

	show_id	type	title	director	cast	country	date_added	release_
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	unk_cast	United States	September 25, 2021	
1	s2	TV Show	Blood & Water	unk_dir	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...	South Africa	September 24, 2021	
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...	unk_country	September 24, 2021	

Unnesting columns

Unnesting director

```

constraint1=data['director'].apply(lambda x: str(x).split(', ')).tolist()

data_director=pd.DataFrame(constraint1,index=data['show_id'])

data_director=data_director.stack()

data_director=pd.DataFrame(data_director)

data_director.reset_index(inplace=True)

data_director=data_director[['show_id',0]]

data_director.columns=['show_id','director1']

```

```
data_director.head()
```

	show_id	director1
0	s1	Kirsten Johnson
1	s2	unk_dir
2	s3	Julien Leclercq
3	s4	unk_dir
4	s5	unk_dir

Unnesting cast

```
constraint2=data['cast'].apply(lambda x: str(x).split(',')).tolist()
```

```
data_cast=pd.DataFrame(constraint2,index=data['show_id'])
```

```
data_cast=data_cast.stack()
```

```
data_cast=pd.DataFrame(data_cast)
```

```
data_cast.reset_index(inplace=True)
```

```
data_cast=data_cast[['show_id',0]]
```

```
data_cast.columns=['show_id','cast1']
```

```
data_cast.head()
```

	show_id	cast1
0	s1	unk_cast
1	s2	Ama Qamata
2	s2	Khosi Ngema
3	s2	Gail Mabalane
4	s2	Thabang Molaba

Unnesting country

```
constraint3=data['country'].apply(lambda x: str(x).split(',')).tolist()
```

```
data_country=pd.DataFrame(constraint3,index=data['show_id'])
```

```
data_country=data_country.stack()
```

```
data_country=pd.DataFrame(data_country)
```

```
data_country.reset_index(inplace=True)
```

```
data_country=data_country[['show_id',0]]
```

```
data_country.columns=['show_id','country1']
```

```
data_country.head()
```

	show_id	country1
0	s1	United States
1	s2	South Africa
2	s3	unk_country

Unnesting listed_in

4	s3	india
---	----	-------

```
constraint4=data['listed_in'].apply(lambda x: str(x).split(' ')).tolist()
```

```
data_listed_in=pd.DataFrame(constraint4,index=data['show_id'])
```

```
data_listed_in=data_listed_in.stack()
```

```
data_listed_in=pd.DataFrame(data_listed_in)
```

```
data_listed_in.reset_index(inplace=True)
```

```
data_listed_in=data_listed_in[['show_id',0]]
```

```
data_listed_in.columns=['show_id','listed_in1']
```

```
data_listed_in.head()
```

	show_id	listed_in1
0	s1	Documentaries
1	s2	International TV Shows
2	s2	TV Dramas
3	s2	TV Mysteries
4	s3	Crime TV Shows

✓ Setting Duration into numericals

```
constraint5=data['duration'].apply(lambda x: str(x).split(' ')).tolist()
```

```
duration1 = [i[0] for i in constraint5]
```

```
data_duration=pd.DataFrame(duration1,index=data['show_id'])
```

```
data_duration.reset_index(inplace=True)
```

```
data_duration=data_duration[['show_id',0]]
```

```
data_duration.columns=['show_id','duration1']
```

```
data_duration.head()
```

	show_id	duration1
0	s1	90
1	s2	2
2	s3	1
3	s4	1
4	s5	2

✓ Merging all the above columns with complete data

```
merge1 = data_director.merge(data_cast.merge(data_country.merge(data_listed_in.merge(data_duration, on = 'show_id'), on = 'show_id'), on='st

data = data.merge(merge1, on = 'show_id')

data.head()
```

	show_id	type	title	director	cast	country	date_added	release_year
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	unk_cast	United States	September 25, 2021	2020
1	s2	TV Show	Blood & Water	unk_dir	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...	South Africa	September 24, 2021	2021
2	s2	TV Show	Blood & Water	unk_dir	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...	South Africa	September 24, 2021	2021
3	s2	TV Show	Blood & Water	unk_dir	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...	South Africa	September 24, 2021	2021
4	s2	TV Show	Blood & Water	unk_dir	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...	South Africa	September 24, 2021	2021

✓ Setting date column

```
data['date_add']=pd.to_datetime(data['date_added'], errors='coerce')

data['month']=data['date_add'].dt.month.fillna(-1)

data['month']=data['month'].astype('int64')

data['year']=data['date_add'].dt.year.fillna(-1)

data['year']=data['year'].astype('int64')

day_name = data['date_add'].dt.day_name()
day_name
```

```
0      Saturday
1      Friday
2      Friday
3      Friday
4      Friday
...
201986  Saturday
201987  Saturday
```

```

201988    Saturday
201989    Saturday
201990    Saturday
Name: date_add, Length: 201991, dtype: object

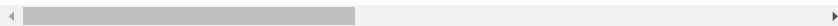
```

```
data['day_name']=data['date_add'].dt.day_name().fillna('unk_day')
```

```
data.head()
```

	show_id	type	title	director	cast	country	date_added	release_year
0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	unk_cast	United States	September 25, 2021	2020
1	s2	TV Show	Blood & Water	unk_dir	Ama Qamata, Khosi Ngema, Gail Mabalané, Thabane...	South Africa	September 24, 2021	2021
2	s2	TV Show	Blood & Water	unk_dir	Ama Qamata, Khosi Ngema, Gail Mabalané, Thabane...	South Africa	September 24, 2021	2021
3	s2	TV Show	Blood & Water	unk_dir	Ama Qamata, Khosi Ngema, Gail Mabalané, Thabane...	South Africa	September 24, 2021	2021
4	s2	TV Show	Blood & Water	unk_dir	Ama Qamata, Khosi Ngema, Gail Mabalané, Thabane...	South Africa	September 24, 2021	2021

5 rows × 22 columns



✓ Removing original director, cast, country, date_added, listed_in and duration

```
df_1 = data
```

```
df_1.drop(columns= ['director','cast','country','date_added','duration','listed_in', 'Date'], inplace = True)
```

```
df_1.head(5)
```

show_id	type	title	release_year	rating	description	director1	cast1
---------	------	-------	--------------	--------	-------------	-----------	-------

```
df_1.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 201991 entries, 0 to 201990
Data columns (total 15 columns):
#   Column          Non-Null Count  Dtype
---  -
0   show_id         201991 non-null object
1   type            201991 non-null object
2   title           201991 non-null object
3   release_year    201991 non-null int64
4   rating          201991 non-null object
5   description      201991 non-null object
6   director1       201991 non-null object
7   cast1           201991 non-null object
8   country1        201991 non-null object
9   listed_in1      201991 non-null object
10  duration1       201991 non-null object
11  date_add        201833 non-null datetime64[ns]
12  month           201991 non-null int64
13  year            201991 non-null int64
14  day_name        201991 non-null object
dtypes: datetime64[ns](1), int64(3), object(11)
memory usage: 24.7+ MB
```

✓ Converting duration1 column to int64 type.

```
df_1['duration']=df_1['duration1'].astype('int64')
```

```
df_1.drop(columns= ['duration1'], inplace = True)#dropping duration1 column
```

```
df_1.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 201991 entries, 0 to 201990
Data columns (total 15 columns):
#   Column          Non-Null Count  Dtype
---  -
0   show_id         201991 non-null object
1   type            201991 non-null object
2   title           201991 non-null object
3   release_year    201991 non-null int64
4   rating          201991 non-null object
5   description      201991 non-null object
6   director1       201991 non-null object
7   cast1           201991 non-null object
8   country1        201991 non-null object
9   listed_in1      201991 non-null object
10  date_add        201833 non-null datetime64[ns]
11  month           201991 non-null int64
12  year            201991 non-null int64
13  day_name        201991 non-null object
14  duration        201991 non-null int64
dtypes: datetime64[ns](1), int64(4), object(10)
memory usage: 24.7+ MB
```

```
movie_dur=df_1[df_1['type']=='Movie'] #data of the movie duration
movie_dur.head()
```

```

    show_id  type    title  release_year  rating  description  director1  ca
0          s1  Movie  Dick Johnson Is Dead      2020   PG-13  As her father nears the end of his life, filmm...  Kirsten Johnson  unk_c
159         s7  Movie  My Little Pony: A New Generation      2021    PG  Equestria's divided. But a bright-eyed hero be...  Robert Cullen  Vane Hudg

My Little Pony: A New Generation
Equestria's divided. But a bright-eyed hero be...

movie_dur[ movie_dur['duration']!=-1]['duration'].aggregate(['max', 'min'])

max      312
min        3
Name: duration, dtype: int64

159         s7  Movie  My Little Pony: A New Generation      2021    PG  a bright-eyed  Cullen  Mars

mv_dur=movie_dur[movie_dur['duration']!=-1].groupby('duration')['show_id'].nunique().reset_index()
mv_dur.columns=['duration','no_of_shows']
mv_dur
```

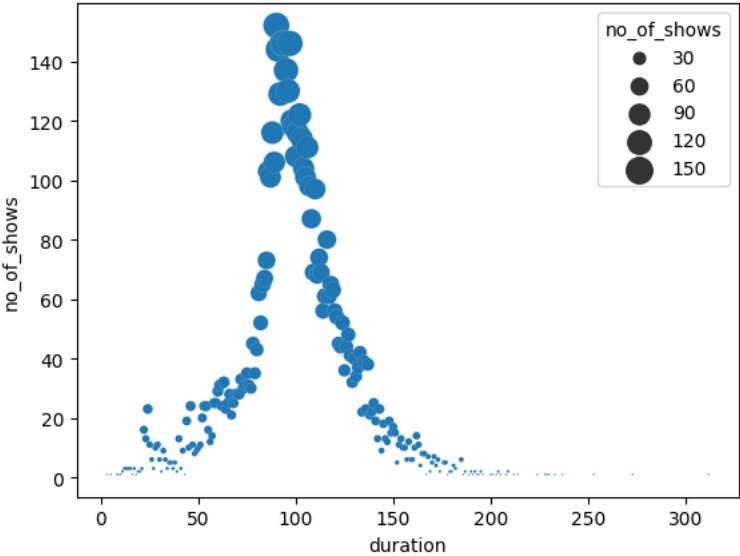
	duration	no_of_shows
0	3	1
1	5	1
2	8	1
3	9	1
4	10	1
...
200	233	1
201	237	1
202	253	1
203	273	1
204	312	1

205 rows × 2 columns

```

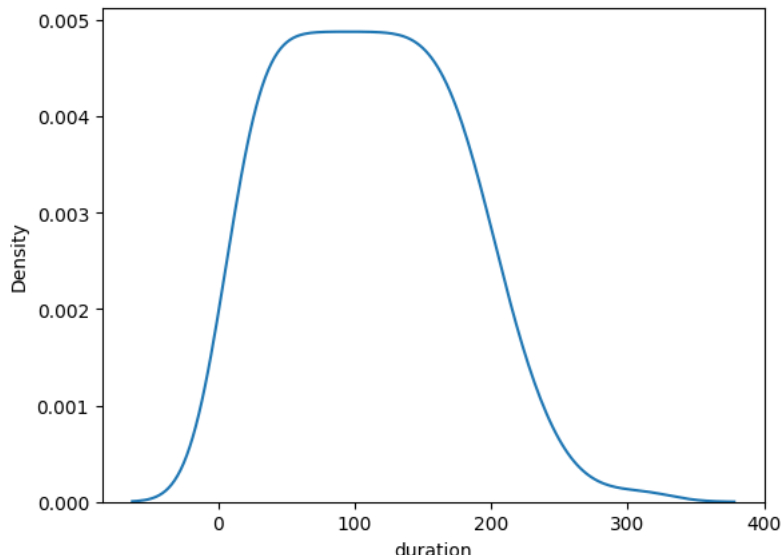
sns.scatterplot(data = mv_dur, x="duration", y='no_of_shows', size=('no_of_shows'), sizes=(1,200))

<Axes: xlabel='duration', ylabel='no_of_shows'>
```



```

sns.kdeplot(data = mv_dur['duration'])
```



- The maximum duration of movies are 312 minutes and the minimum duration is 3 minutes and these are the outliers
- More movies are in the range of around 50 minutes to 160 minutes

```
tv=df_1[df_1['type']=='TV Show']
tv.head()
```

show_id	type	title	release_year	rating	description	director1	cast1	col
1	s2	TV Show	Blood & Water	2021	TV-MA	After crossing paths at a party, a Cape Town t...	unk_dir	Ama Qamata
2	s2	TV Show	Blood & Water	2021	TV-MA	After crossing paths at a party, a Cape Town t...	unk_dir	Ama Qamata

```
tv[ tv['duration']!=-1]['duration'].aggregate(['max', 'min'])
```

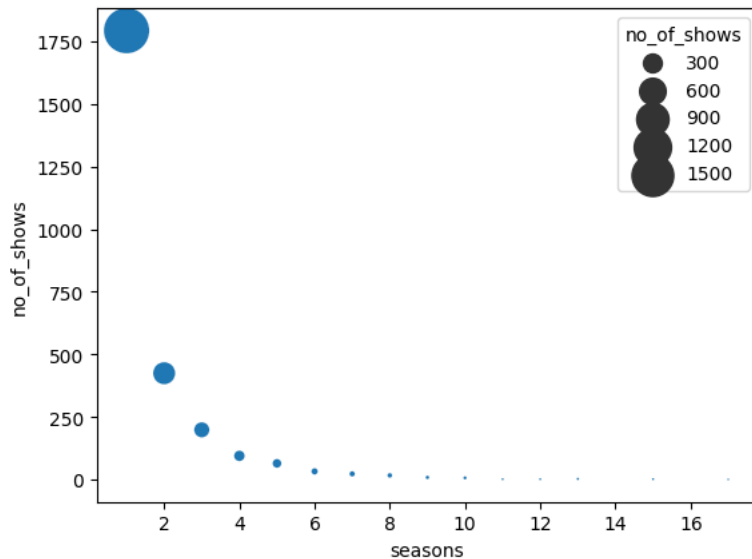
```
max    17
min     1
Name: duration, dtype: int64
```

```
TVshow_dur=df_1[(df_1['type']=='TV Show') & (df_1['duration']!=-1)].groupby(['duration'])['show_id'].nunique().sort_values(ascending=False)
TVshow_dur.columns=['seasons', 'no_of_shows']
TVshow_dur
```

	seasons	no_of_shows
0	1	1793
1	2	425
2	3	199

```
sns.scatterplot(data = TVshow_dur, x="seasons", y='no_of_shows', size='no_of_shows', sizes=(1,600))
```

```
<Axes: xlabel='seasons', ylabel='no_of_shows'>
```



- There are more tv shows which have only one season.
- There is only one tv show with 17 seasons. This is an outlier.

✓ Analysis on number of directors, cast, countries, and release year.

```
df_1['director1'].nunique()
```

```
4994
```

```
df_1['cast1'].nunique()
```

```
36440
```

```
df_1['country1'].nunique()
```

```
128
```

```
df_1['release_year'].nunique()
```

```
74
```

- There are 4994 unique directors, 36440 actors in the data given.
- The shows released in 128 countries are present in this given data.
- There are shows released in 74 years.

```
rating=df_1.groupby('rating')['show_id'].nunique().sort_values(ascending=False).reset_index()
```

```
rating.columns=['rating', 'no_of_shows']
```

```
rating
```

	rating	no_of_shows
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	unk_rating	4
13	NC-17	3
14	UR	3

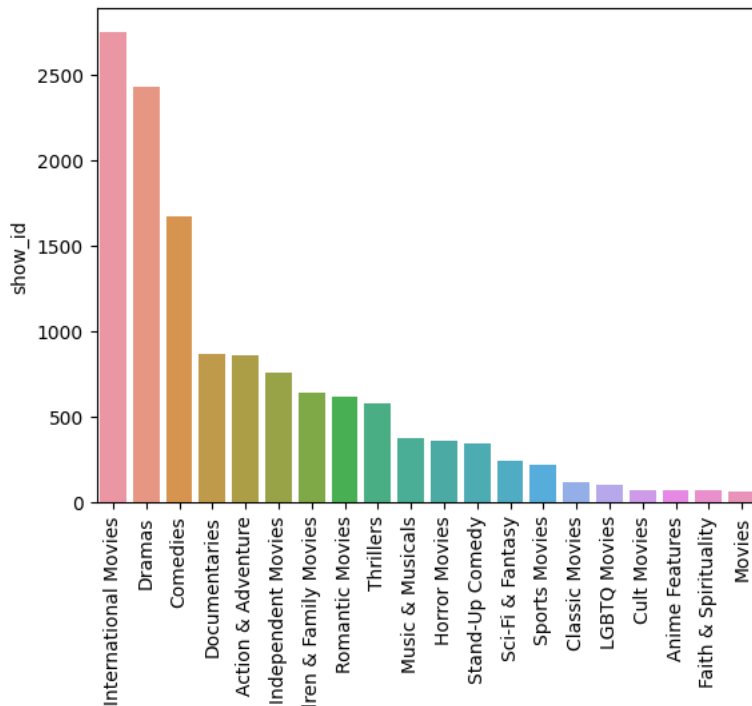
✓ Which genre shows are released more on Netflix?

```
genreM=df_1[df_1['type']=='Movie'].groupby(['listed_in1'])['show_id'].nunique().sort_values(ascending=False).reset_index()
genreM
```

	listed_in1	show_id
0	International Movies	2752
1	Dramas	2427
2	Comedies	1674
3	Documentaries	869
4	Action & Adventure	859
5	Independent Movies	756
6	Children & Family Movies	641
7	Romantic Movies	616
8	Thrillers	577
9	Music & Musicals	375
10	Horror Movies	357
11	Stand-Up Comedy	343
12	Sci-Fi & Fantasy	243
13	Sports Movies	219
14	Classic Movies	116
15	LGBTQ Movies	102
16	Cult Movies	71
17	Anime Features	71
18	Faith & Spirituality	65
19	Movies	57

```
sns.barplot(x='listed_in1', y='show_id', data=genreM)
plt.xticks(rotation=90)
```

```
(array([ 0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 15, 16,
        17, 18, 19]),
[Text(0, 0, 'International Movies'),
Text(1, 0, 'Dramas'),
Text(2, 0, 'Comedies'),
Text(3, 0, 'Documentaries'),
Text(4, 0, 'Action & Adventure'),
Text(5, 0, 'Independent Movies'),
Text(6, 0, 'Children & Family Movies'),
Text(7, 0, 'Romantic Movies'),
Text(8, 0, 'Thrillers'),
Text(9, 0, 'Music & Musicals'),
Text(10, 0, 'Horror Movies'),
Text(11, 0, 'Stand-Up Comedy'),
Text(12, 0, 'Sci-Fi & Fantasy'),
Text(13, 0, 'Sports Movies'),
Text(14, 0, 'Classic Movies'),
Text(15, 0, 'LGBTQ Movies'),
Text(16, 0, 'Cult Movies'),
Text(17, 0, 'Anime Features'),
Text(18, 0, 'Faith & Spirituality'),
Text(19, 0, 'Movies')])
```



- There are more number of International Movies added on Netflix followed by Dramas, Comedies
- There are very few movies belonging to genre Cult, Anime, Faith & Spirituality

```
genreTV=df_1[df_1['type']=='TV Show'].groupby(['listed_in1'])['show_id'].nunique().sort_values(ascending=False).reset_index()
genreTV.columns=['listed_in1','no_of_tvshows']
genreTV
```



```

    listed_in1  no_of_tvshows
0      International TV Shows      1351
1              TV Dramas           763
2              TV Comedies          581
3      Crime TV Shows              470
4              Kids' TV             451
5              Docuseries           395
6      Romantic TV Shows           370
7              Reality TV           255
8      British TV Shows            253
9              Anime Series         176

sns.barplot(x='listed_in1', y='no_of_tvshows', data=genreTV)
plt.xticks(rotation=90)
```

```
(array([ 0,  1,  2,  3,  4,  5,  6,  7,  8,  9, 10, 11, 12, 13, 14, 15, 16,
        17, 18, 19, 20, 21]),
      )
```

- There are more number of International TV Shows added on Netflix followed by TV Dramas
- There are very few TV Shows belonging to genre Stand-Up Comedy & Talk Shows and Classic & Cult

```
Text(A[0,0] "Kids' TV")
```

✓ The number of movies produced in each country and pick the top 10 countries

```
country1 = df['country1']
MPC=df_1[df_1['type']=='Movie'].groupby('country1')['show_id'].nunique().sort_values(ascending=False)
MPC=MPC.reset_index()
MPC      #Netflix has released movies in approximately 123 countries.
```

	country1	show_id
0	United States	2751
1	India	962
2	United Kingdom	532
3	unk_country	440
4	Canada	319
...
118	Nicaragua	1
119	Palestine	1
120	Panama	1
121	Paraguay	1
122	Malawi	1

123 rows × 2 columns



```
MPC[MPC['country1']!='unk_country'].head(10)
#top 10 countries which produce the more number of movies.
#according to the data US has produced the most number of movies.
```

	country1	show_id
0	United States	2751
1	India	962
2	United Kingdom	532
4	Canada	319
5	France	303
6	Germany	182
7	Spain	171
8	Japan	119
9	China	114
10	Mexico	111

- The number of movies added to Netflix from the USA is the highest and it is followed by India and UK
- The number of movies added to Netflix from the Mexico is the least and it is followed by China and Japan
- More number of movies from the region Mexico, Japan and China can be added to attract viewers from that region.

✓ The number of TV Shows produced in each country and pick the top 10 countries

```
TPC=df_1[df_1['type']=='TV Show'].groupby('country1')['show_id'].nunique().sort_values(ascending=False)
TPC=TPC.reset_index()
TPC
```

	country1	show_id
0	United States	938
1	unk_country	391
2	United Kingdom	272
3	Japan	199
4	South Korea	170
...
62	Mauritius	1
63	Senegal	1
64	Puerto Rico	1
65	Hungary	1
66		1

67 rows × 2 columns

```
TPC[TPC['country1'] != 'unk_country'].head(10)
```

	country1	show_id
0	United States	938
2	United Kingdom	272
3	Japan	199
4	South Korea	170
5	Canada	126
6	France	90
7	India	84
8	Taiwan	70
9	Australia	66
10	Spain	61

Double-click (or enter) to edit

- The number of TV Shows added to Netflix from the USA is the highest and it is followed by UK and Japan
- The number of tv shows added to Netflix from Spain is the least and it is followed by Australia, Taiwan and India.
- More number of TV Shows from the countries Spain, Australia, Taiwan and India can be added to attract viewers from that region.

✓ The best time to launch a TV show?

the best week to release the Tv-show or the movie

```
BWM=df_1[df_1['type']=='Movie'].groupby('day_name')['show_id'].nunique().sort_values(ascending=False).reset_index()
BWM.columns=['day_name', 'no_of_shows']
BWM
```

	day_name	no_of_shows
--	----------	-------------

BWM.head(1)

	day_name	no_of_shows
0	Friday	1566

```
BWT=df_1[df_1['type']=='TV Show'].groupby('day_name')['show_id'].nunique().sort_values(ascending=False).reset_index()
BWT.columns=['day_name', 'no_of_shows']
BWT
```

	day_name	no_of_shows
0	Friday	932
1	Wednesday	382
2	Tuesday	345
3	Thursday	343
4	Saturday	259
5	Monday	223
6	Sunday	182
7	unk_day	10

BWT.head(1)

	day_name	no_of_shows
0	Friday	932

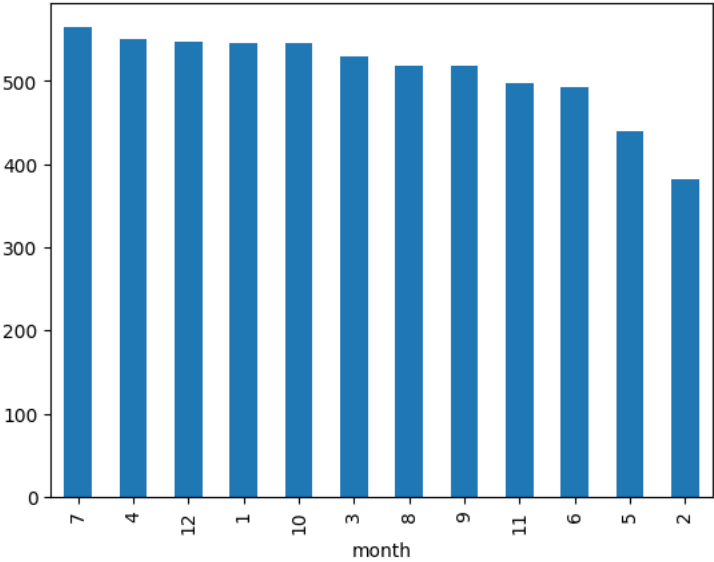
- There are two things which we can notice. Considering the weekends, more movies are added on Friday and Thursday. That might be good as more viewers are free then, there is high chance of them watching the movies
- The other thing is since a very few movies are released on Saturday and Sunday, releasing more movies on these days could also increase the chances of viewers watching the movies
- More number of TV Shows are added on Friday and very few are added on Sunday.
- More number of TV shows can be added on Sunday because there are few shows added, the chances of watching the show added on that day will be high.

✓ The best month to release the TV-show or the movie

```
BMM=df_1[df_1['type']=='Movie'].groupby('month')['show_id'].nunique().sort_values(ascending=False).reset_index()
BMM.columns=['month', 'no_of_shows']
BMM
```

```
month no_of_shows
0      7      565

BMMG=df_1[df_1['type']=='Movie'].groupby('month')['show_id'].nunique().sort_values(ascending=False).plot(kind='bar')
```



- There are very few movies added in February so adding more movies in that month increase the chance of watching the movies added on that month.

```
BMM.head(1)

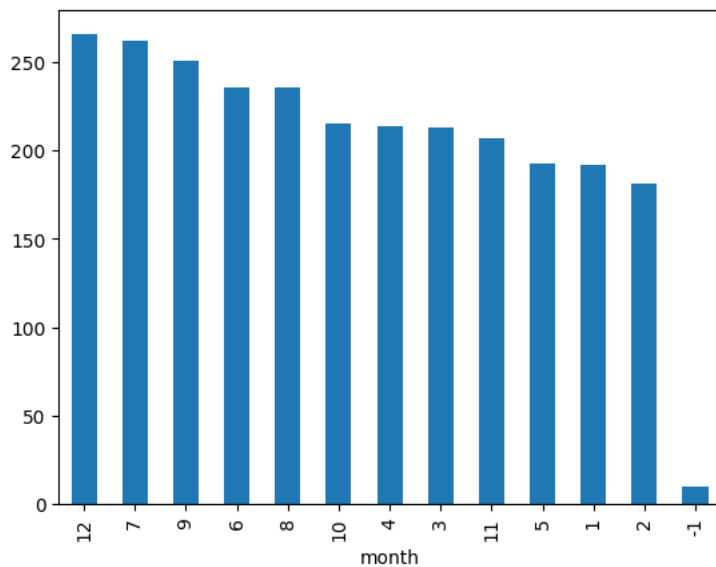
month no_of_shows
0      7      565
```

The highest number of movies are added in the month of July.

```
BMT=df_1[df_1['type']=='TV Show'].groupby('month')['show_id'].nunique().sort_values(ascending=False).reset_index()
BMT.columns=['month', 'no_of_shows']
BMT
```

	month	no_of_shows
0	12	266
1	7	262
2	9	251
3	6	236
4	8	236
5	10	215
6	4	214
7	3	213
8	11	207
9	5	193
10	1	192
11	2	181
12	-1	10

```
BMTG=df_1[df_1['type']=='TV Show'].groupby('month')['show_id'].nunique().sort_values(ascending=False).plot(kind='bar')
```



- The highest number of Tv shows are added in December but we can also see that in July also almost the same number of TV shows are added.
- Since a few TV shows are added in February, January and May, we can add more TV sows in these months as there is a high chances of viewers watching these shows

```
BMT.head(1)
```

	month	no_of_shows
0	12	266

The highest number of Tv shows are added in December

✓ Analysis of actors/directors of different types of shows/movies

The top 10 directors who have appeared in most movies

```
BD=df_1.groupby('director1')['show_id'].nunique().sort_values(ascending=False)
BD=BD.reset_index()
BD.columns=['director1', 'no_of_shows']
BD
```

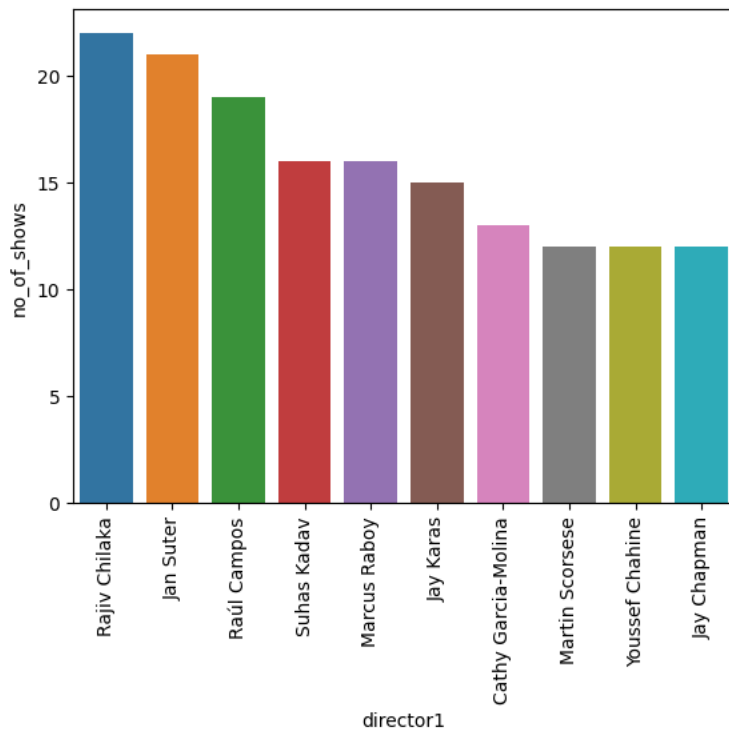
	director1	no_of_shows
0	unk_dir	2634
1	Rajiv Chilaka	22
2	Jan Suter	21
3	Raúl Campos	19
4	Suhas Kadav	16
...
4989	Brandon Camp	1
4990	Juan Antin	1
4991	Juan Antonio de la Riva	1
4992	Juan Camilo Pinzon	1
4993	María Jose Cuevas	1

4994 rows × 2 columns

```
BD10=BD[BD['director1']!= 'unk_dir'].head(10)
```

```
sns.barplot(data=BD10, x='director1', y='no_of_shows')
plt.xticks(rotation=90)
```

```
(array([0, 1, 2, 3, 4, 5, 6, 7, 8, 9]),
 [Text(0, 0, 'Rajiv Chilaka'),
  Text(1, 0, 'Jan Suter'),
  Text(2, 0, 'Raúl Campos'),
  Text(3, 0, 'Suhas Kadav'),
  Text(4, 0, 'Marcus Raboy'),
  Text(5, 0, 'Jay Karas'),
  Text(6, 0, 'Cathy Garcia-Molina'),
  Text(7, 0, 'Martin Scorsese'),
  Text(8, 0, 'Youssef Chahine'),
  Text(9, 0, 'Jay Chapman')])
```



The shows directed by Rajiv Chilaka is the highest followed by Jan Suter.

```
BDM=df_1[df_1['type']=='Movie'].groupby('director1')['show_id'].nunique().sort_values(ascending=False).reset_index()
BDM.columns=['director', 'no_of_shows']
BDM
```

	director	no_of_shows
0	unk_dir	188
1	Rajiv Chilaka	22
2	Jan Suter	21
3	Raúl Campos	19
4	Suhas Kadav	16
...
4773	José Ortuño	1
4774	Bob Persichetti	1
4775	Jovanka Vuckovic	1
4776	Bob Odenkirk	1
4777	Mary Lambert	1

4778 rows × 2 columns

```
BDM[BDM['director']!= 'unk_dir'].head(10)
```

	director	no_of_shows
1	Rajiv Chilaka	22
2	Jan Suter	21
3	Raúl Campos	19
4	Suhas Kadav	16
5	Marcus Raboy	15
6	Jay Karas	15
7	Cathy Garcia-Molina	13
8	Youssef Chahine	12
9	Martin Scorsese	12
10	Jay Chapman	12

The movies directed by Rajiv Chilaka is the highest followed by Jan Suter on Netflix.

```
BDT=df_1[df_1['type']=='TV Show'].groupby('director1')['show_id'].nunique().sort_values(ascending=False).reset_index()
BDT.columns=['director', 'no_of_shows']
BDT
```

	director	no_of_shows
0	unk_dir	2446
1	Ken Burns	3
2	Alastair Fothergill	3
3	Jung-ah Im	2
4	Joe Berlinger	2
...
295	Houda Benyamina	1
296	Hong Won-ki	1
297	Hiroyuki Seshita	1
298	Hikaru Toda	1
299	Kim Seong-hun	1

300 rows × 2 columns

```
BDT[BDT['director']!= 'unk_dir'].head(10)
```

	director	no_of_shows
1	Ken Burns	3
2	Alastair Fothergill	3
3	Jung-ah Im	2
4	Joe Berlinger	2
5	Hsu Fu-chun	2
6	Stan Lathan	2
7	Gautham Vasudev Menon	2
8	Lynn Novick	2
9	Shin Won-ho	2
10	Iginio Straffi	2

Ken Burns and Alastair Fothergill have directed the highest number of TV Shows on netflix.


```
BA=df_1.groupby('cast1')['show_id'].nunique().sort_values(ascending=False).reset_index()
BA.columns=['cast', 'no_of_shows']
BA
```

	cast	no_of_shows
0	unk_cast	825
1	Anupam Kher	43
2	Shah Rukh Khan	35
3	Julie Teiwani	33
4	Naseeruddin Shah	32
...
36435	Jamie Lee	1
36436	Jamie Kenna	1
36437	Jamie Kaler	1
36438	Jamie Johnston	1
36439	Şopê Dirisû	1

36440 rows × 2 columns

```
BA[BA['cast'] != 'unk_cast'].head(10)
```

	cast	no_of_shows
1	Anupam Kher	43
2	Shah Rukh Khan	35
3	Julie Teiwani	33
4	Naseeruddin Shah	32
5	Takahiro Sakurai	32
6	Rupa Bhimani	31
7	Om Puri	30
8	Akshay Kumar	30
9	Yuki Kaji	29
10	Paresh Rawal	28

```
BAM=df_1[df_1['type']=='Movie'].groupby('cast1')['show_id'].nunique().sort_values(ascending=False).reset_index()
BAM.columns=['cast', 'no_of_shows']
BAM
```

	cast	no_of_shows
0	unk_cast	475
1	Anupam Kher	42
2	Shah Rukh Khan	35
3	Naseeruddin Shah	32
4	Akshay Kumar	30
...
25947	Jacob Blair	1
25948	Jacob Bertrand	1
25949	Jacob Batalon	1
25950	Jacob Artist	1
25951	Şopê Dirisû	1

25952 rows × 2 columns

```
BAM[BAM['cast'] != 'unk_cast'].head(10)
```

	cast	no_of_shows
1	Anupam Kher	42
2	Shah Rukh Khan	35
3	Naseeruddin Shah	32
4	Akshay Kumar	30
5	Om Puri	30
6	Amitabh Bachchan	28
7	Paresh Rawal	28
8	Julie Tejawani	28
9	Rupa Bhimani	27
10	Boman Irani	27

Anupam Kher has acted in most number of movies followed by Shah Rukh Khan.

```
BAT=df_1[df_1['type']=='TV Show'].groupby('cast1')['show_id'].nunique().sort_values(ascending=False).reset_index()
BAT.columns=['cast', 'no_of_shows']
BAT
```

	cast	no_of_shows
0	unk_cast	350
1	Takahiro Sakurai	25
2	Yuki Kaji	19
3	Daisuke Ono	17
4	Ai Kayano	17
...
14859	Ivy Yin	1
14860	Iván Pellicer	1
14861	Iván Álvarez de Araya	1
14862	Iza Moreira	1
14863	Şükrü Özyıldız	1

14864 rows × 2 columns

```
BAT[BAT['cast']!='unk_cast'].head(10)
```

	cast	no_of_shows
1	Takahiro Sakurai	25
2	Yuki Kaji	19
3	Daisuke Ono	17
4	Ai Kayano	17
5	Junichi Suwabe	17
6	Yuichi Nakamura	16
7	Yoshimasa Hosoya	15
8	Jun Fukuyama	15
9	David Attenborough	14
10	Vincent Tong	13

Takahiro Sakurai has acted in most number of TV Shows.

✓ How has the number of movies released per year changed over the last 20-30 years?

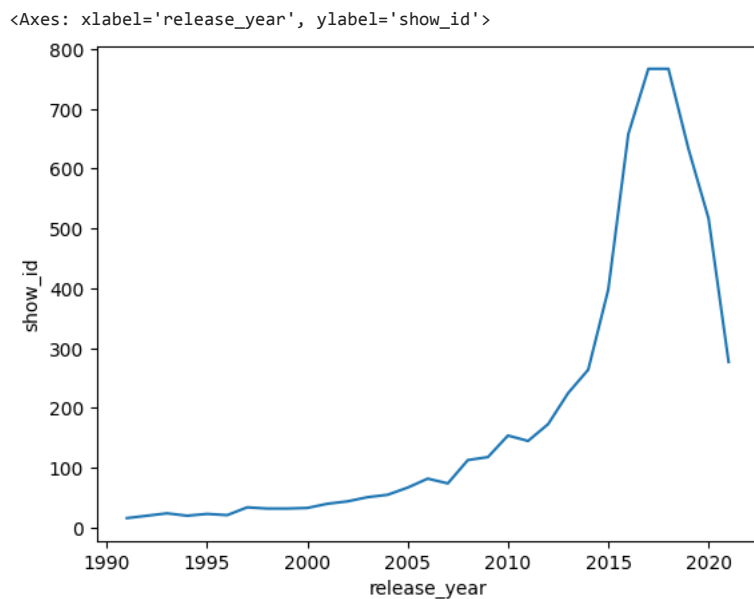
```
df_2=df_1[df_1['type']=='Movie'].groupby(['release_year'])['show_id'].nunique().sort_values()
df_2=df_2.reset_index()
df_2
```

	release_year	show_id
0	1963	1
1	1966	1
2	1946	1
3	1947	1
4	1961	1
...
68	2020	517
69	2019	633
70	2016	658
71	2017	767
72	2018	767

73 rows × 2 columns

```
df_3=df_2[df_2['release_year']>=1991] #movies produced in last 30 years
```

```
sns.lineplot(data=df_3, x='release_year', y='show_id')
```



- There is an increase in the number of movies added on netflix over the past 20 t 30 years.
- There is a steep increase in the movies added from 2014 to 2018 and afterwards there is a decrease in the number of movies added.

✓ Understanding what content is available in different countries

```
df_1['rating']=df_1['rating'].str.replace(' min','unk_rating')
df_1['rating'].nunique()
```

```
rating=df_1[df_1['rating']!='unk_rating'].groupby(['rating', 'country1'])['show_id'].nunique().sort_values(ascending=False).reset_index()
rating.columns=['rating', 'country1', 'no_of_shows']
rating
```

	rating	country1	no_of_shows
0	TV-MA	United States	1100
1	R	United States	660
2	TV-14	India	572
3	TV-14	United States	497
4	PG-13	United States	433
...
524	TV-G	Kenya	1
525	TV-G	Nigeria	1
526	TV-G	Peru	1
527	TV-G	South Africa	1
528	UR	United States	1

529 rows × 3 columns

- TV-MA contents are released more in the USA followed by rating of R in the USA
- UR contents are released very few in the US
- In India TV-14 contents are released more.

```
MVrating=df_1[(df_1['rating']!='unk_rating') & (df_1['type']!='Movie')].groupby(['rating', 'country1'])['show_id'].nunique().sort_values(ascending=False)
MVrating.columns=['rating', 'country1', 'no_of_shows']
MVrating#Analysis of ratings for movies
```

	rating	country1	no_of_shows
0	TV-MA	United States	382
1	TV-14	United States	221
2	TV-MA	unk_country	138
3	TV-PG	United States	124
4	TV-MA	United Kingdom	115
...
194	TV-MA	Malta	1
195	TV-MA	Malaysia	1
196	TV-MA	Luxembourg	1
197	TV-MA	Lebanon	1
198	TV-Y7-FV	Canada	1

199 rows × 3 columns

```
rating.loc[rating['country1']=='India']#analysis of ratings in India
```

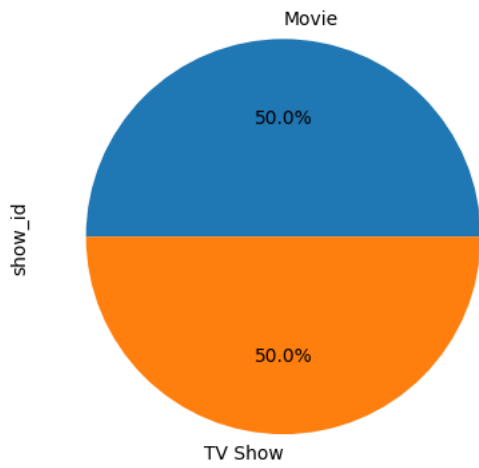
	rating	country1	no_of_shows
2	TV-14	India	572
7	TV-MA	India	266
15	TV-PG	India	144

- In India TV-14 shows are produced more.
- 7 TV-Y7-FV, R are produced very few.

✓ Does Netflix has more focus on tvshows than movies in recent years

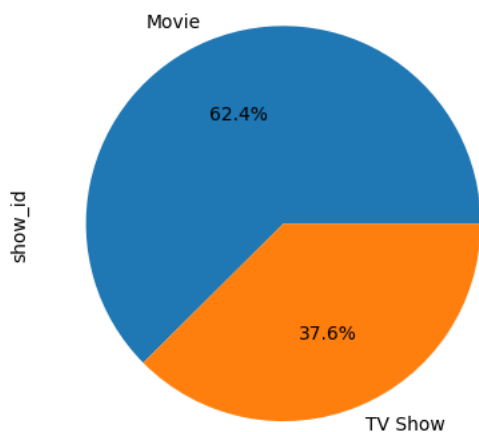
```
162      NR      India      /
past_data=df_1[(df_1['year']==2008) & (df_1['year']>2000)].groupby('type')['show_id'].nunique().plot(kind='pie', autopct='%1.1f%%')
past_data
```

<Axes: ylabel='show_id'>



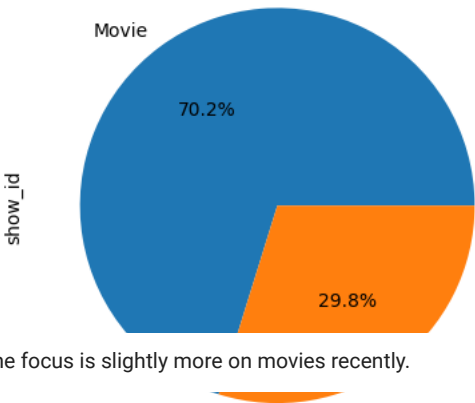
```
past_data=df_1[(df_1['year']<=2016) & (df_1['year']>2000)].groupby('type')['show_id'].nunique().plot(kind='pie', autopct='%1.1f%%')
past_data
```

<Axes: ylabel='show_id'>



```
recent_data=df_1[(df_1['year']>2016)].groupby('type')['show_id'].nunique().plot(kind='pie', autopct='%1.1f%%')
recent_data
```

<Axes: ylabel='show_id'>



No. The focus is slightly more on movies recently.