Problem Link:

 $https://www.scaler.com/academy/mentee-dashboard/class/42351/project/problems/17748? \\ navref=cl_tt_lst_nm$

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

Initial Exploration

```
In [335... data = pd.read_csv("netflix.csv")
    data.head(8)
```

Out[335]:		show_id	type	title	director	cast	country	date_added	release_year	rating
	0	s1	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
	5	s6	TV Show	Midnight Mass	Mike Flanagan	Kate Siegel, Zach Gilford, Hamish Linklater, H	NaN	September 24, 2021	2021	TV- MA
	6	s7	Movie	My Little Pony: A New Generation	Robert Cullen, José Luis Ucha	Vanessa Hudgens, Kimiko Glenn, James Marsden,	NaN	September 24, 2021	2021	PG
	7	s8	Movie	Sankofa	Haile Gerima	Kofi Ghanaba, Oyafunmike Ogunlano, Alexandra D	United States, Ghana, Burkina Faso, United Kin	September 24, 2021	1993	TV- MA
4										•

In [336... data.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
                            8807 non-null
                                            object
               type
           2
              title
                            8807 non-null object
           3
              director
                            6173 non-null object
                            7982 non-null object
           4
              cast
           5
              country
                            7976 non-null object
           6 date_added
                            8797 non-null object
           7
               release_year 8807 non-null int64
               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 [337...
          data.isna().sum()
          show_id
                             0
Out[337]:
                             0
          type
          title
                             0
          director
                          2634
          cast
                           825
          country
                           831
          date_added
                            10
          release_year
                            0
          rating
                             4
                             3
          duration
          listed in
                             0
                             0
          description
          dtype: int64
          data.describe()
In [338...
Out[338]:
                release_year
          count 8807.000000
          mean
                2014.180198
                   8.819312
            std
                1925.000000
            min
           25%
                2013.000000
           50%
                2017.000000
           75%
                2019.000000
                2021.000000
           max
          data.describe(include = ["object"]).T
In [339...
```

Out[339]:

	count	unique	top	freq
show_id	8807	8807	s1	1
type	8807	2	Movie	6131
title	8807	8807	Dick Johnson Is Dead	1
director	6173	4528	Rajiv Chilaka	19
cast	7982	7692	David Attenborough	19
country	7976	748	United States	2818
date_added	8797	1767	January 1, 2020	109
rating	8803	17	TV-MA	3207
duration	8804	220	1 Season	1793
listed_in	8807	514	Dramas, International Movies	362
description	8807	8775	Paranormal activity at a lush, abandoned prope	4

In [340... #We do not require description for our analysis for now. However, it can be used us data.drop("description", axis = 1, inplace = True) data

Out[340]:		show_id	type	title	director	cast	country	date_added	release_year	ratin
	0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	September 25, 2021	2020	PG-1
						Ama Qamata, Khosi				

0	s1	Movie	Johnson Is Dead	Johnson	NaN	States	25, 2021	2020	PG-1
1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	September 24, 2021	2021	T\ M
2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	NaN	September 24, 2021	2021	T\ M
3	s4	TV Show	Jailbirds New Orleans	NaN	NaN	NaN	September 24, 2021	2021	T\ M
4	s5	TV Show	Kota Factory	NaN	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	September 24, 2021	2021	T\ M
•••									
8802	s8803	Movie	Zodiac	David Fincher	Mark Ruffalo, Jake Gyllenhaal, Robert Downey J	United States	November 20, 2019	2007	
8803	s8804	TV Show	Zombie Dumb	NaN	NaN	NaN	July 1, 2019	2018	TV-Y
8804	s8805	Movie	Zombieland	Ruben Fleischer	Jesse Eisenberg, Woody Harrelson, Emma Stone,	United States	November 1, 2019	2009	
8805	s8806	Movie	Zoom	Peter Hewitt	Tim Allen, Courteney Cox, Chevy Chase, Kate Ma	United States	January 11, 2020	2006	Р
8806	s8807	Movie	Zubaan	Mozez Singh	Vicky Kaushal, Sarah-Jane Dias, Raaghav Chanan	India	March 2, 2019	2015	TV-1

Problems Encountered

- 1. Nested Data Director, Cast, Country, Listed_In
- 2. Missing Values
- 3. Unstructured Data (Duration column)
- 4. Date_added column has dates in multiple formats
- 5. Tabular Representation tough to understand

Solutions

- 1. Split Data using str.split(",") then use hstack to create multiple dataframes and finally use merge **OR** we can use melt and pivot too
- 2. Instead of dropping missing values, we will try to keep most data intact by replacing NaN's with groupby-mode ooperation. Also, rows where we have empty string " " need to be converted to np.nan
- 3. Duration needs to be divided into minutes for movies and seasons for TV shows. To find aggregates, we can perform groupby + agg
- 4. Converting Date to Datetime
- 5. Generate insights using charts

Order of Execution

We will perform all the steps that are not dependent on the values present in nested data columns. Therefore, no grouby operations. The operations are as follows

- Standardizing date_time columns
- Checking and removing null values of columns which don't depend on value of other columns
- Structuring duration column
- De-nesting data
- Removing null-values and generating insighs based on de-nested data

Standardizing date_added column

```
In [341... data["date_added"] = pd.to_datetime(data["date_added"]).dt.strftime('%d-%m-%Y')
    data["release_year"] = pd.to_datetime(data["release_year"], format = "%Y").dt.strft
    # IMP --> strftime converts the datatype of the whole column back to object (string
    # the column's datatype back to datetime
    data
```

Out[341]:		show_id	type	title	director	cast	country	date_added	release_year	ratin
	0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	25-09-2021	2020	PG-1
	1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	24-09-2021	2021	T\ M
	2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	NaN	24-09-2021	2021	T\ M
	3	s4	TV Show	Jailbirds New Orleans	NaN	NaN	NaN	24-09-2021	2021	T\ M
	4	s5	TV Show	Kota Factory	NaN	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	24-09-2021	2021	T\ M
	•••									
	8802	s8803	Movie	Zodiac	David Fincher	Mark Ruffalo, Jake Gyllenhaal, Robert Downey J	United States	20-11-2019	2007	
	8803	s8804	TV Show	Zombie Dumb	NaN	NaN	NaN	01-07-2019	2018	TV-Y
	8804	s8805	Movie	Zombieland	Ruben Fleischer	Jesse Eisenberg, Woody Harrelson, Emma Stone,	United States	01-11-2019	2009	
	8805	s8806	Movie	Zoom	Peter Hewitt	Tim Allen, Courteney Cox, Chevy Chase, Kate Ma	United States	11-01-2020	2006	Р
	8806	s8807	Movie	Zubaan	Mozez Singh	Vicky Kaushal, Sarah-Jane Dias, Raaghav Chanan	India	02-03-2019	2015	TV-1

Empty string check

```
In [342...
          data.count()
                           8807
          show_id
Out[342]:
                           8807
          type
          title
                           8807
          director
                           6173
          cast
                           7982
          country
                           7976
          date_added
                           8797
          release_year
                           8807
                           8803
          rating
          duration
                           8804
          listed_in
                           8807
          dtype: int64
 In [343... def check_empty_strings(df):
               for col name in df.columns:
                   print("\ncol_name:", col_name, ", nan_values:", df[col_name].isna().sum(),
                   if (df[col_name].isna().sum() + df[col_name].count() != 8807):
                       return ("Empty strings found in column:", col_name)
                   else:
                       pass
               return "\nNo empty strings found"
          print(check_empty_strings(data))
          col_name: show_id , nan_values: 0 , not-nan values: 8807
          col_name: type , nan_values: 0 , not-nan values: 8807
          col_name: title , nan_values: 0 , not-nan values: 8807
          col_name: director , nan_values: 2634 , not-nan values: 6173
          col_name: cast , nan_values: 825 , not-nan values: 7982
          col_name: country , nan_values: 831 , not-nan values: 7976
          col_name: date_added , nan_values: 10 , not-nan values: 8797
          col_name: release_year , nan_values: 0 , not-nan values: 8807
          col_name: rating , nan_values: 4 , not-nan values: 8803
          col_name: duration , nan_values: 3 , not-nan values: 8804
          col_name: listed_in , nan_values: 0 , not-nan values: 8807
          No empty strings found
```

Duplicate value check

```
In [344... data[data.duplicated(subset=['show_id', 'title'])]
```

Out[344]: show_id type title director cast country date_added release_year rating duration listed

Filling "date_added" null values

In [345... data.loc[data["date_added"].isnull()]

Out[345]:	show_id	type	title	director	cast	country	date_added	release_year	ratin

		_	71				•	_	_3	
(6066	s6067	TV Show	A Young Doctor's Notebook and Other Stories	NaN	Daniel Radcliffe, Jon Hamm, Adam Godley, Chris	United Kingdom	NaN	2013	T\ M
(6174	s6175	TV Show	Anthony Bourdain: Parts Unknown	NaN	Anthony Bourdain	United States	NaN	2018	TV-P
(6795	s6796	TV Show	Frasier	NaN	Kelsey Grammer, Jane Leeves, David Hyde Pierce	United States	NaN	2003	TV-P
(6806	s6807	TV Show	Friends	NaN	Jennifer Aniston, Courteney Cox, Lisa Kudrow,	United States	NaN	2003	TV-1
(6901	s6902	TV Show	Gunslinger Girl	NaN	Yuuka Nanri, Kanako Mitsuhashi, Eri Sendai, Am	Japan	NaN	2008	TV-1
•	7196	s7197	TV Show	Kikoriki	NaN	lgor Dmitriev	NaN	NaN	2010	TV-
·	7254	s7255	TV Show	La Familia P. Luche	NaN	Eugenio Derbez, Consuelo Duval, Luis Manuel Áv	United States	NaN	2012	TV-1
	7406	s7407	TV Show	Maron	NaN	Marc Maron, Judd Hirsch, Josh Brener, Nora Zeh	United States	NaN	2016	T\ M
•	7847	s7848	TV Show	Red vs. Blue	NaN	Burnie Burns, Jason Saldaña, Gustavo Sorola, G	United States	NaN	2015	N
*	8182	s8183	TV Show	The Adventures of Figaro Pho	NaN	Luke Jurevicius, Craig Behenna, Charlotte Haml	Australia	NaN	2015	TV-Y

```
In [346...
missing_locs = data.loc[data["date_added"].isnull()]
data["date_added"].fillna(value = pd.to_datetime(data["release_year"]).dt.strftime
data[data["date_added"].index.isin(missing_locs.index)]
```

Out[346]:	show_id	type	title	director		cast	country	date_added	release_year	ratin
					_					

	_	٠.				•	_		
6066	s6067	TV Show	A Young Doctor's Notebook and Other Stories	NaN	Daniel Radcliffe, Jon Hamm, Adam Godley, Chris	United Kingdom	01-01-2013	2013	T\ M
6174	s6175	TV Show	Anthony Bourdain: Parts Unknown	NaN	Anthony Bourdain	United States	01-01-2018	2018	TV-P
6795	s6796	TV Show	Frasier	NaN	Kelsey Grammer, Jane Leeves, David Hyde Pierce	United States	01-01-2003	2003	TV-P
6806	s6807	TV Show	Friends	NaN	Jennifer Aniston, Courteney Cox, Lisa Kudrow,	United States	01-01-2003	2003	TV-1
6901	s6902	TV Show	Gunslinger Girl	NaN	Yuuka Nanri, Kanako Mitsuhashi, Eri Sendai, Am	Japan	01-01-2008	2008	TV-1
7196	s7197	TV Show	Kikoriki	NaN	lgor Dmitriev	NaN	01-01-2010	2010	TV-
7254	s7255	TV Show	La Familia P. Luche	NaN	Eugenio Derbez, Consuelo Duval, Luis Manuel Áv	United States	01-01-2012	2012	TV-1
7406	s7407	TV Show	Maron	NaN	Marc Maron, Judd Hirsch, Josh Brener, Nora Zeh	United States	01-01-2016	2016	T\ M
7847	s7848	TV Show	Red vs. Blue	NaN	Burnie Burns, Jason Saldaña, Gustavo Sorola, G	United States	01-01-2015	2015	N
8182	s8183	TV Show	The Adventures of Figaro Pho	NaN	Luke Jurevicius, Craig Behenna, Charlotte Haml	Australia	01-01-2015	2015	TV-Y

```
In [347...
          # Now that release year and date added columns have been standardized, we can conve
          # We need to do this since strftime converts the columns to string objects
          data["date added"] = pd.to datetime(data["date added"], format = "%d-%m-%Y")
          data["release_year"] = pd.to_datetime(data["release_year"], format = "%Y")
          data.dtypes
          show_id
                                   object
Out[347]:
          type
                                   object
          title
                                   object
          director
                                   object
                                   object
          cast
          country
                                   object
          date_added
                           datetime64[ns]
          release_year
                           datetime64[ns]
          rating
                                   object
          duration
                                   object
          listed in
                                   object
          dtype: object
          Filling "duration" null values
         data.loc[data["duration"].isnull()]
```

In [348	uata.	TOCLUALA	[uura	CION 1.15	suntt()]						
Out[348]:		show_id	type	title	director	cast	country	date_added	release_year	rating	dura
	5541	s5542	Movie	Louis C.K. 2017		Louis C.K.	United States	2017-04-04	2017-01-01	74 min	I
	5794	s5795	Movie	Louis C.K.: Hilarious	Louis C.K.	Louis C.K.	United States	2016-09-16	2010-01-01	84 min	ı
	5813	s5814	Movie	Louis C.K.: Live at the Comedy Store	Louis C.K.	Louis C.K.	United States	2016-08-15	2015-01-01	66 min	I

```
In [349...
missing_locs = data.loc[data["duration"].isnull()]
data["duration"].fillna(value = data["rating"], axis = 0, inplace = True) #duration
data["rating"].loc[data.index.isin(missing_locs.index)] = np.nan #replacing rating
data[data.index.isin(missing_locs.index)]
```

C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\181485828.py:3: SettingWithCopyW
arning:

A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stabl e/user_guide/indexing.html#returning-a-view-versus-a-copy data["rating"].loc[data.index.isin(missing_locs.index)] = np.nan #replacing rating col values with NaN

Out[349]:		show_id	type	title	director	cast	country	date_added	release_year	rating	dura
	5541	s5542	Movie	Louis C.K. 2017	Louis C.K.	Louis C.K.	United States	2017-04-04	2017-01-01	NaN	74
	5794	s5795	Movie	Louis C.K.: Hilarious	Louis C.K.	Louis C.K.	United States	2016-09-16	2010-01-01	NaN	84
	5813	s5814	Movie	Louis C.K.: Live at the Comedy Store	Louis C.K.	Louis C.K.	United States	2016-08-15	2015-01-01	NaN	66
4											•

Diving dataframe into movies and tv shows

Movies and TV-Shows have a lot of differences so it makes sense to divide the dataframe into these parts

Therefore, we will first divide the shows between TV_shows and Movies

```
In [350... data["type"].value_counts(normalize = True)*100

Out[350]: Movie    69.615079
    TV Show    30.384921
    Name: type, dtype: float64

In [351... movies = data[data["type"] == "Movie"]
    movies.head(8)
```

Out[351]:		show_id	type	title	director	cast	country	date_added	release_year	ra
	0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	2021-09-25	2020-01-01	P
	6	s7	Movie	My Little Pony: A New Generation	Robert Cullen, José Luis Ucha	Vanessa Hudgens, Kimiko Glenn, James Marsden,	NaN	2021-09-24	2021-01-01	
	7	s8	Movie	Sankofa	Haile Gerima	Kofi Ghanaba, Oyafunmike Ogunlano, Alexandra D	United States, Ghana, Burkina Faso, United Kin	2021-09-24	1993-01-01	
	9	s10	Movie	The Starling	Theodore Melfi	Melissa McCarthy, Chris O'Dowd, Kevin Kline, T	United States	2021-09-24	2021-01-01	Pi
	12	s13	Movie	Je Suis Karl	Christian Schwochow	Luna Wedler, Jannis Niewöhner, Milan Peschel,	Germany, Czech Republic	2021-09-23	2021-01-01	
	13	s14	Movie	Confessions of an Invisible Girl	Bruno Garotti	Klara Castanho, Lucca Picon, Júlia Gomes, Marc	NaN	2021-09-22	2021-01-01	T/
	16	s17	Movie	Europe's Most Dangerous Man: Otto Skorzeny in 	Pedro de Echave García, Pablo Azorín Williams	NaN	NaN	2021-09-22	2020-01-01	
	18	s19	Movie	Intrusion	Adam Salky	Freida Pinto, Logan Marshall- Green, Robert Joh	NaN	2021-09-22	2021-01-01	Т

In [352... tv_shows = data[data["type"] == "TV Show"]
 tv_shows.head(8)

Out[352]:		show_id	type	title	director	cast	country	date_added	release_year	rating
	1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	2021-09-24	2021-01-01	TV- MA
	2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	NaN	2021-09-24	2021-01-01	TV- MA
	3	s4	TV Show	Jailbirds New Orleans	NaN	NaN	NaN	2021-09-24	2021-01-01	TV- MA
	4	s5	TV Show	Kota Factory	NaN	Mayur More, Jitendra Kumar, Ranjan Raj, Alam K	India	2021-09-24	2021-01-01	TV- MA
	5	s6	TV Show	Midnight Mass	Mike Flanagan	Kate Siegel, Zach Gilford, Hamish Linklater, H	NaN	2021-09-24	2021-01-01	TV- MA
	8	s9	TV Show	The Great British Baking Show	Andy Devonshire	Mel Giedroyc, Sue Perkins, Mary Berry, Paul Ho	United Kingdom	2021-09-24	2021-01-01	TV-14
	10	s11	TV Show	Vendetta: Truth, Lies and The Mafia	NaN	NaN	NaN	2021-09-24	2021-01-01	TV- MA
	11	s12	TV Show	Bangkok Breaking	Kongkiat Komesiri	Sukollawat Kanarot, Sushar Manaying, Pavarit M	NaN	2021-09-23	2021-01-01	TV- MA
4										

In [353... movies["duration"] = movies["duration"].str.split("min").str[0]
ALT --> movies['duration'].str.split(expand=True)[0]
movies["duration"] = movies["duration"].astype("int32")
movies.head(3)

C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\902548781.py:1: SettingWithCopyW
arning:

A value is trying to be set on a copy of a slice from a DataFrame.

Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

movies["duration"] = movies["duration"].str.split("min").str[0]

C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\902548781.py:3: SettingWithCopyW
arning:

A value is trying to be set on a copy of a slice from a DataFrame.

Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stabl
e/user_guide/indexing.html#returning-a-view-versus-a-copy
movies["duration"] = movies["duration"].astype("int32")

							71 - (-	- /		
Out[353]:		show_id	type	title	director	cast	country	date_added	release_year	rating
	0	s1	Movie	Dick Johnson Is Dead	Kirsten Johnson	NaN	United States	2021-09-25	2020-01-01	PG-13
	6	s7	Movie	My Little Pony: A New Generation	Robert Cullen, José Luis Ucha	Vanessa Hudgens, Kimiko Glenn, James Marsden,	NaN	2021-09-24	2021-01-01	PG
	7	s8	Movie	Sankofa	Haile Gerima	Kofi Ghanaba, Oyafunmike Ogunlano, Alexandra D	United States, Ghana, Burkina Faso, United Kin	2021-09-24	1993-01-01	TV- MA

In [354...
tv_shows["duration"] = tv_shows["duration"].str.split("Season").str[0]
ALT --> tv_shows['duration'].str.split(expand=True)[0]
tv_shows["duration"] = tv_shows["duration"].astype("int32")
tv_shows.head(3)

C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\1726177719.py:1: SettingWithCopy
Warning:

A value is trying to be set on a copy of a slice from a DataFrame. Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

tv_shows["duration"] = tv_shows["duration"].str.split("Season").str[0]

C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\1726177719.py:3: SettingWithCopy
Warning:

A value is trying to be set on a copy of a slice from a DataFrame.

Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
tv_shows["duration"] = tv_shows["duration"].astype("int32")

Out[354]:		show_id	type	title	director	cast	country	date_added	release_year	rating	du
	1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	2021-09-24	2021-01-01	TV- MA	
	2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	NaN	2021-09-24	2021-01-01	TV- MA	
	3	s4	TV Show	Jailbirds New Orleans	NaN	NaN	NaN	2021-09-24	2021-01-01	TV- MA	
4											•

Filling null-values in "rating" column

In [355	movies	[movies	"rating"	.isnull(()

TII [222	movies[movies[racing]:isnair()]									
Out[355]:		show_id	type	title	director	cast	country	date_added	release_year	ra
	5541	s5542	Movie	Louis C.K. 2017	Louis C.K.	Louis C.K.	United States	2017-04-04	2017-01-01	
	5794	s5795	Movie	Louis C.K.: Hilarious	Louis C.K.	Louis C.K.	United States	2016-09-16	2010-01-01	
	5813	s5814	Movie	Louis C.K.: Live at the Comedy Store	Louis C.K.	Louis C.K.	United States	2016-08-15	2015-01-01	
	5989	s5990	Movie	13TH: A Conversation with Oprah Winfrey & Ava	NaN	Oprah Winfrey, Ava DuVernay	NaN	2017-01-26	2017-01-01	
	7537	s7538	Movie	My Honor Was Loyalty	Alessandro Pepe	Leone Frisa, Paolo Vaccarino, Francesco Miglio	Italy	2017-03-01	2015-01-01	

Out[356]:		show_id	type	title	director	cast	country	date_added	release_year	rating		
	5541	s5542	Movie	Louis C.K. 2017	Louis C.K.	Louis C.K.	United States	2017-04-04	2017-01-01	NaN		
	5794	s5795	Movie	Louis C.K.: Hilarious	Louis C.K.	Louis C.K.	United States	2016-09-16	2010-01-01	NaN		
	5813	s5814	Movie	Louis C.K.: Live at the Comedy Store	Louis C.K.	Louis C.K.	United States	2016-08-15	2015-01-01	NaN		
	7537	s7538	Movie	My Honor Was Loyalty	Alessandro Pepe	Leone Frisa, Paolo Vaccarino, Francesco Miglio	Italy	2017-03-01	2015-01-01	NaN		
4										•		
In [357	mode mode	= movies	["rati	ng"].mode	e()[0]							
Out[357]:	'TV-M	Α'										
In [358	movie	<pre>missing_locs = movies[movies["rating"].isnull()] movies["rating"].fillna(value = mode, axis=0, inplace=True) movies.loc[movies.index.isin(missing_locs.index)]</pre>										
	Warni	C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\2872612556.py:2: SettingWithCopy Warning: A value is trying to be set on a copy of a slice from a DataFrame										
	e/use	See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy movies["rating"].fillna(value = mode, axis=0, inplace=True)										

Out[358]:		show_id	type	title	direct	or	cast	country	date_adde	d release_ye	ear ra
	5541	s5542	Movie	Louis C.K. 2017	Louis C	.K. Louis	c.K.	United States	2017-04-0)4 2017-01-	-01
	5794	s5795	Movie	Louis C.K.: Hilarious	Louis C	.K. Louis	C.K.	United States	2016-09-1	6 2010-01-	-01
	5813	s5814	Movie	Louis C.K.: Live at the Comedy Store	Louis C	.K. Louis	c.K.	United States	2016-08-1	5 2015-01-	-01
	5989	s5990	Movie	13TH: A Conversation with Oprah Winfrey & Ava	Na	Win	prah frey, Ava ernay	NaN	2017-01-2	26 2017-01-	-01
	7537	s7538	Movie	My Honor Was Loyalty	Alessand Pe _l	ro F pe Vacca Franc		ltaly	2017-03-0	01 2015-01-	-01
4											>
In [359	tv_sh	ows[tv_s	hows["	rating"].isr	null()]						
Out[359]:		show_id	type	title di	rector	cast	cou	ntry dat	e_added r	elease_year	rating
	6827	s6828	TV Show	Gargantia on the Verdurous Planet	NaN Ka	Kaito Ishikawa, Hisako anemoto, ii Kayano, Ka	J	apan 20	16-12-01	2013-01-01	NaN
	7312	s7313	TV Show	Little Lunch	NaN Lı	Flynn Curry, Olivia Deeble, Madison u, Oisín	Aust	tralia 20	18-02-01	2015-01-01	NaN
4											>
In [360	tv_sh explo	ows["lis ded_df =	ted_in tv_sh	hows.loc[tv_ "].str.split ows.explode(d_df["rating	(", ") ("listed	_in")			colist()		
Out[360]:	['Ani	me Serie	s, Int	ernational T	V Shows	', "Kids	' TV	, TV Con	nedies"]		
In [361				ed_df.groupb oded_df[exp]							
Out[361]:				listed_in	rating						
_	0 An	ime Series,	Internat	ional TV Shows	TV-14						
	1		Kids' T	V, TV Comedies	TV-Y7						

```
In [362... tv_shows.loc[6827, 'rating'] = "TV-14"
            tv_shows.loc[7312, 'rating'] = "TV-Y7"
            tv_shows[tv_shows.index.isin(missing_locs.index)]
Out[362]:
                   show_id
                             type
                                        title director
                                                                   country date_added release_year rating
                                                            Kaito
                                    Gargantia
                                                         Ishikawa,
                               TV
                                      on the
                                                           Hisako
            6827
                     s6828
                                                 NaN
                                                                     Japan
                                                                             2016-12-01
                                                                                          2013-01-01 TV-14
                            Show
                                   Verdurous
                                                        Kanemoto,
                                       Planet
                                                        Ai Kayano,
                                                             Ka...
                                                            Flynn
                                                            Curry,
                                        Little
                               TV
                                                            Olivia
            7312
                     s7313
                                                                             2018-02-01
                                                                                          2015-01-01 TV-Y7
                                                 NaN
                                                                   Australia
                            Show
                                       Lunch
                                                          Deeble,
                                                         Madison
                                                        Lu, Oisín ...
```

De-nesting dataframe

To fill other null values, we can't directly take the mean/mode of the whole column and fill them. We must find shows with similar characteristics and then take their mean. Also, to generate insights, we need to de-nest the dataframe.

Filling Cast, Director and Country Missing columns

To fill up these columns, let us check if can we find correlation of these columns to other columns

IMP LINKS:

- 1. https://stackoverflow.com/questions/41710789/boolean-series-key-will-be-reindexed-to-match-dataframe-index
- 2. https://stackoverflow.com/questions/47136436/python-pandas-convert-value-counts-output-to-dataframe

3. https://stackoverflow.com/questions/23668427/pandas-three-way-joining-multiple-dataframes-on-columns

```
In [365...
         movies denested = de nester(movies, "listed in")
         temp1 = movies_denested[["listed_in"]][(movies["cast"].isnull())].value_counts().re
         temp2 = movies_denested[["listed_in"]][(movies["director"].isnull())].value_counts
         temp3 = movies_denested[["listed_in"]][(movies["country"].isnull())].value_counts()
         pd.concat([df.set_index('listed_in') for df in [temp1, temp2, temp3]], axis=1, join
         #pd.merge(temp3, pd.merge(temp1, temp2, on="listed_in", how = "outer"), on = "listed_in"
         # movies_denested[["listed_in", "rating"]][(movies["cast"].isnull())].value_counts
         # We can see that a lot of movies without a cast or director are actually documente
         # as they don't have a defined cast/director
         C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\1800344805.py:3: UserWarning: Bo
         olean Series key will be reindexed to match DataFrame index.
           temp1 = movies_denested[["listed_in"]][(movies["cast"].isnull())].value_counts
         ().reset_index(name='Null Cast Count')
         C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\1800344805.py:4: UserWarning: Bo
         olean Series key will be reindexed to match DataFrame index.
           temp2 = movies_denested[["listed_in"]][(movies["director"].isnull())].value_coun
         ts().reset_index(name='Null Director Count')
         C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\1800344805.py:5: UserWarning: Bo
         olean Series key will be reindexed to match DataFrame index.
           temp3 = movies_denested[["listed_in"]][(movies["country"].isnull())].value_count
         s().reset_index(name='Null Country Count')
```

- 1	isted	ın

Documentaries	424.0	57.0	75
International Movies	178.0	47.0	209
Sports Movies	54.0	7.0	18
Music & Musicals	35.0	17.0	47
Children & Family Movies	33.0	36.0	106
LGBTQ Movies	17.0	4.0	5
Comedies	12.0	32.0	94
Dramas	11.0	25.0	110
Classic Movies	7.0	NaN	1
Romantic Movies	7.0	11.0	28
Action & Adventure	6.0	8.0	42
Faith & Spirituality	5.0	NaN	2
Movies	4.0	23.0	23
Sci-Fi & Fantasy	3.0	3.0	1
Horror Movies	3.0	2.0	17
Independent Movies	3.0	5.0	11
Anime Features	3.0	1.0	8
Cult Movies	1.0	NaN	1
Stand-Up Comedy	1.0	25.0	32
Thrillers	NaN	2.0	28

```
temp1 = tv_show_denested[["listed_in"]][(tv_shows["cast"].isnull())].value_counts()
temp2 = tv_show_denested[["listed_in"]][(tv_shows["director"].isnull())].value_cour
temp3 = tv_show_denested[["listed_in"]][(tv_shows["country"].isnull())].value_count
pd.concat([df.set_index('listed_in') for df in [temp1, temp2, temp3]], axis=1, joil
C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\1000636975.py:3: UserWarning: Bo
olean Series key will be reindexed to match DataFrame index.
 temp1 = tv_show_denested[["listed_in"]][(tv_shows["cast"].isnull())].value_count
s().reset index(name='Null Cast Count')
C:\Users\Mrudul\AppData\Local\Temp\ipykernel 1604\1000636975.py:4: UserWarning: Bo
olean Series key will be reindexed to match DataFrame index.
  temp2 = tv_show_denested[["listed_in"]][(tv_shows["director"].isnull())].value_c
ounts().reset index(name='Null Director Count')
C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\1000636975.py:5: UserWarning: Bo
olean Series key will be reindexed to match DataFrame index.
  temp3 = tv_show_denested[["listed_in"]][(tv_shows["country"].isnull())].value_co
unts().reset_index(name='Null Country Count')
```

In [366... tv_show_denested = de_nester(tv_shows, "listed_in")

listed in	

isteu_iii			
Docuseries	207.0	335	65
International TV Shows	109.0	1223	223
Reality TV	92.0	249	50
Crime TV Shows	75.0	401	49
British TV Shows	45.0	228	16
Kids' TV	42.0	433	81
Science & Nature TV	35.0	88	10
TV Comedies	24.0	539	80
Romantic TV Shows	13.0	341	71
Spanish-Language TV Shows	12.0	158	29
Stand-Up Comedy & Talk Shows	7.0	44	9
TV Dramas	6.0	702	100
TV Mysteries	5.0	86	6
TV Shows	5.0	5	7
Korean TV Shows	4.0	141	15
TV Thrillers	3.0	54	4
Anime Series	3.0	165	22
TV Horror	3.0	66	3
Teen TV Shows	3.0	66	3
TV Sci-Fi & Fantasy	2.0	79	5
TV Action & Adventure	2.0	152	15
Classic & Cult TV	NaN	24	1

```
In [333... movies["country"].fillna("Unknown Country", inplace = True)
movies["cast"].fillna("Unknown Cast", inplace = True)
movies["director"].fillna("Unknown Director", inplace=True)

tv_shows["country"].fillna("Unknown Country", inplace=True)
tv_shows["cast"].fillna("Unknown Cast", inplace=True)
tv_shows["director"].fillna("Unknown Director", inplace=True)

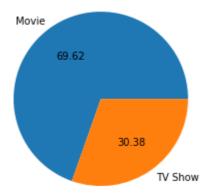
print(movies.isnull().sum().sum(), tv_shows.isnull().sum().sum())
```

```
C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\2890977746.py:1: SettingWithCopy
Warning:
A value is trying to be set on a copy of a slice from a DataFrame
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stabl
e/user_guide/indexing.html#returning-a-view-versus-a-copy
 movies["country"].fillna("Unknown Country", inplace = True)
C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\2890977746.py:2: SettingWithCopy
Warning:
A value is trying to be set on a copy of a slice from a DataFrame
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stabl
e/user guide/indexing.html#returning-a-view-versus-a-copy
 movies["cast"].fillna("Unknown Cast", inplace = True)
C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\2890977746.py:3: SettingWithCopy
Warning:
A value is trying to be set on a copy of a slice from a DataFrame
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stabl
e/user_guide/indexing.html#returning-a-view-versus-a-copy
 movies["director"].fillna("Unknown Director", inplace=True)
C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\2890977746.py:5: SettingWithCopy
A value is trying to be set on a copy of a slice from a DataFrame
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stabl
e/user_guide/indexing.html#returning-a-view-versus-a-copy
 tv shows["country"].fillna("Unknown Country", inplace=True)
C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\2890977746.py:6: SettingWithCopy
Warning:
A value is trying to be set on a copy of a slice from a DataFrame
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stabl
e/user_guide/indexing.html#returning-a-view-versus-a-copy
 tv_shows["cast"].fillna("Unknown Cast", inplace=True)
C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\2890977746.py:7: SettingWithCopy
Warning:
A value is trying to be set on a copy of a slice from a DataFrame
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stabl
e/user_guide/indexing.html#returning-a-view-versus-a-copy
 tv_shows["director"].fillna("Unknown Director", inplace=True)
```

Visual Analysis and Insights

```
In [183... plt.title("Netflix Titles Distribution")
  plt.pie(data["type"].value_counts(), labels = data["type"].value_counts().index, ac
  plt.show()
```

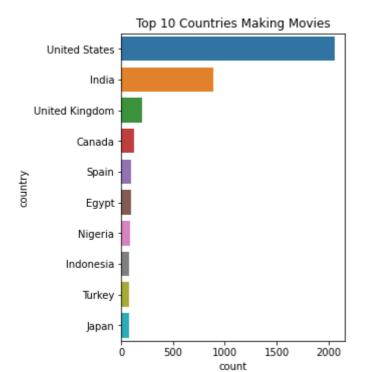
Netflix Titles Distribution



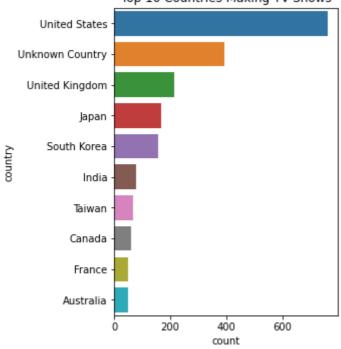
```
In [184... fig, axs = plt.subplots(nrows = 2, ncols = 1 , figsize=(4, 5))

# movies.drop(movies.loc[movies["country"] == "Unknown Country"], axis = 1, inplace
sns.countplot(y = movies["country"], order = movies["country"].value_counts().index
    title="Top 10 Countries Making Movies")
sns.countplot(y = tv_shows["country"], order = tv_shows["country"].value_counts().:
    title="Top 10 Countries Making TV-Shows")

plt.subplots_adjust(top = 2)
plt.show()
```

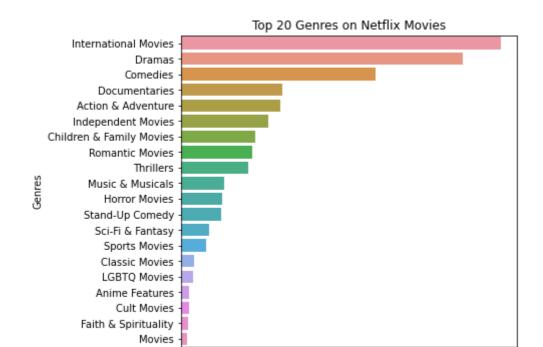


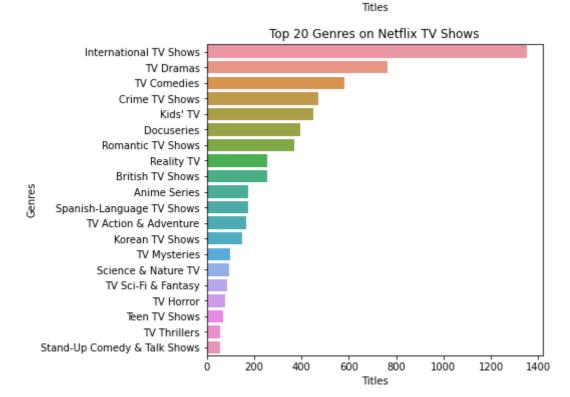




```
In [185... fig, axs = plt.subplots(nrows = 2, ncols = 1 )

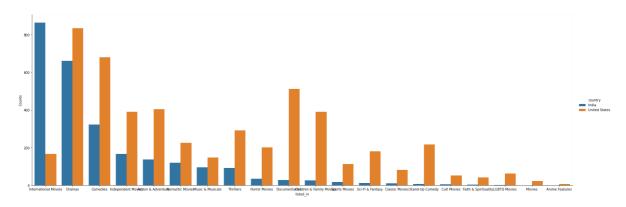
denested_genre = de_nester(movies, "listed_in")
sns.countplot(y = denested_genre["listed_in"], order = denested_genre["listed_in"]
    title = 'Top 20 Genres on Netflix Movies', xlabel = 'Titles', ylabel = 'Genres denested_genre = de_nester(tv_shows, "listed_in")
sns.countplot(y = denested_genre["listed_in"], order = denested_genre["listed_in"]
    title = 'Top 20 Genres on Netflix TV Shows', xlabel = 'Titles', ylabel = 'Genre plt.subplots_adjust(top = 2.5)
plt.show()
```





```
In [186... #TOP Movie and TV_Show genres across countries

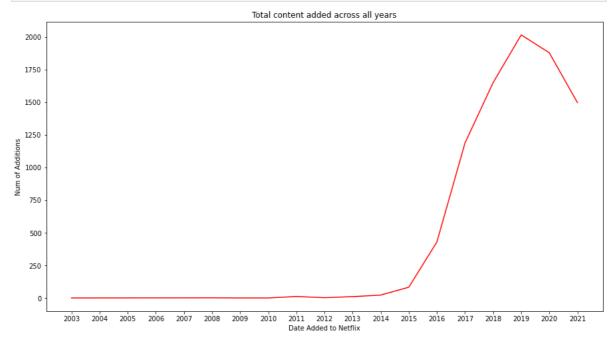
country_list = ["India", "United States", "United_Kingdom"]
   denested_country = de_nester(movies, "country")
   filtered_country = denested_country[denested_country["country"].isin(country_list)
   denested_genre = de_nester(filtered_country, "listed_in")
   grouped_df = denested_genre.groupby("country")[["listed_in"]].value_counts().reset_
   sns.catplot(data = grouped_df, x = "listed_in", y = "Counts", hue = 'country', kind # width = aspect * height
   plt.show()
```

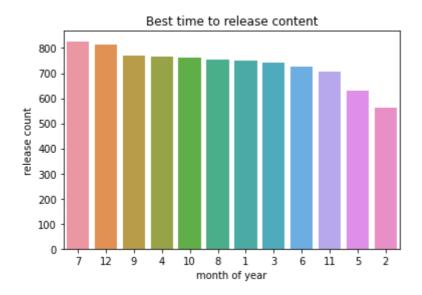


```
In [412...

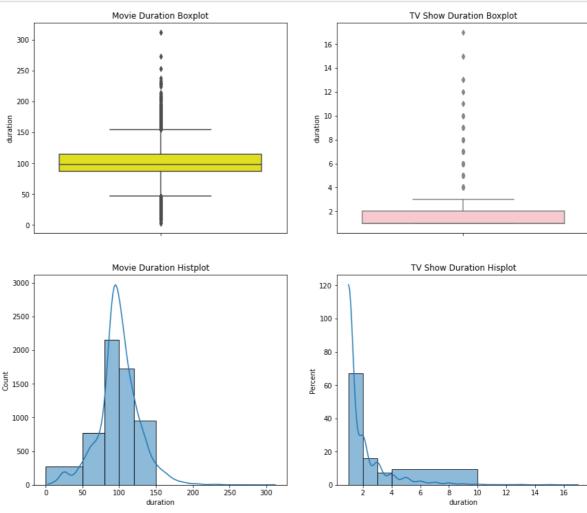
df_years = data.groupby(data["date_added"].dt.year)["type"].size().reset_index(name
plt.figure(figsize=(15,8))

sns.lineplot(data = df_years, x="date_added", y="counts", color = "red")
plt.xticks(np.arange(2003, 2022, 1))
plt.title("Total content added across all years")
plt.ylabel("Num of Additions")
plt.xlabel("Date Added to Netflix")
plt.show()
```

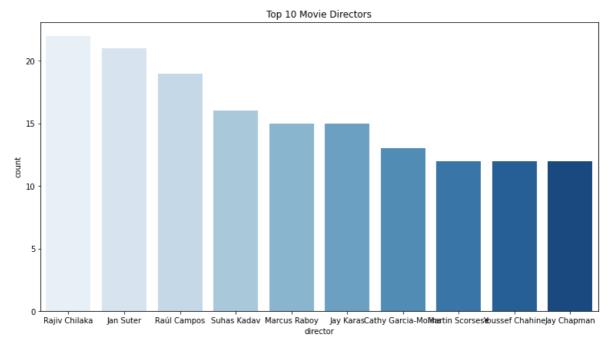


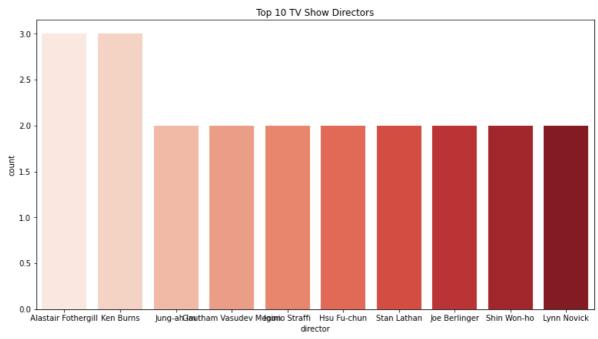


```
In [939...
fig, axs = plt.subplots(nrows = 2, ncols = 2 , figsize=(6, 5))
sns.boxplot(y = movies["duration"], ax = axs[0][0], color = "yellow").set(
    title='Movie Duration Boxplot')
sns.boxplot(y = tv_shows["duration"], ax = axs[0][1], color = "pink").set(
    title='TV Show Duration Boxplot')
sns.histplot(movies["duration"], bins = [0, 50, 80, 100, 120, 150], stat = "count"
    title='Movie Duration Histplot')
sns.histplot(tv_shows["duration"], bins = [1, 2, 3, 4, 10], stat = "percent", kde stitle='TV Show Duration Hisplot')
plt.subplots_adjust(right = 2, top = 2)
plt.show()
```



fig, axs = plt.subplots(nrows = 2, ncols = 1, figsize=(13, 4))





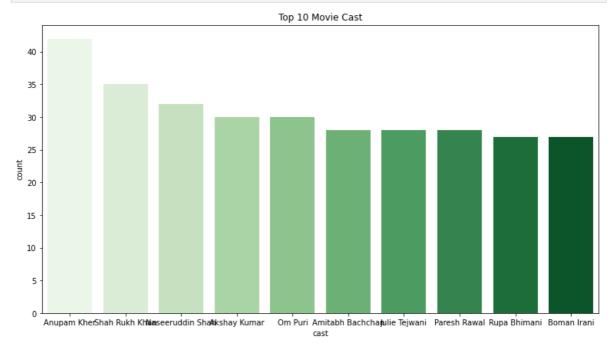
```
In [419... fig, axs = plt.subplots(nrows = 2, ncols = 1, figsize=(13, 4))

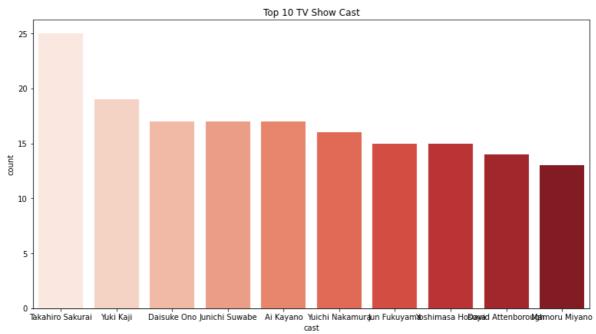
denested_cast_movies = de_nester(movies, "cast")
denested_cast_movies["cast"].dropna(inplace= True)
denested_cast_tv_shows = de_nester(tv_shows, "cast")
denested_cast_tv_shows["cast"].dropna(inplace= True)

sns.countplot(x = denested_cast_movies["cast"] , order = denested_cast_movies["cast"]
```

```
palette='Greens', ax = axs[0]).set(title = "Top 10 Movie Cast")
sns.countplot(x = denested_cast_tv_shows["cast"] , order = denested_cast_tv_shows['palette='Reds', ax = axs[1]).set(title = "Top 10 TV Show Cast")

plt.subplots_adjust(top = 3)
plt.show()
```





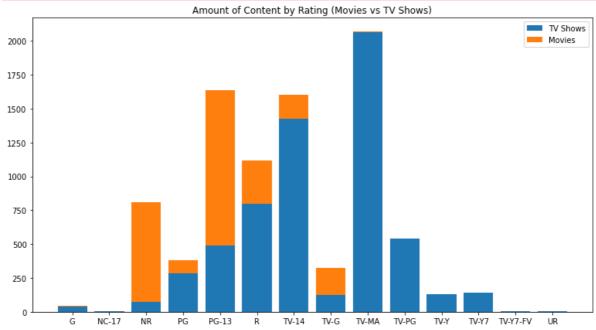
```
count_movies = movies.groupby('rating')['title'].count().reset_index()
count_shows = tv_shows.groupby('rating')['title'].count().reset_index()
count_shows = count_shows.append(
    [{"rating" : "NC-17", "title" : 0},
        {"rating" : "PG-13", "title" : 0},
        {"rating" : "UR", "title" : 0},
        {"rating" : "G", "title" : 0},
        {"rating" : "PG", "title" : 0}], ignore_index=True)

#Have to do this as TV shows have more types of ratings than movies
count_shows.sort_values(by="rating", ascending=True)
plt.figure(figsize=(13,7))
plt.title('Amount of Content by Rating (Movies vs TV Shows)')
plt.bar(count_movies.rating, count_movies.title)
```

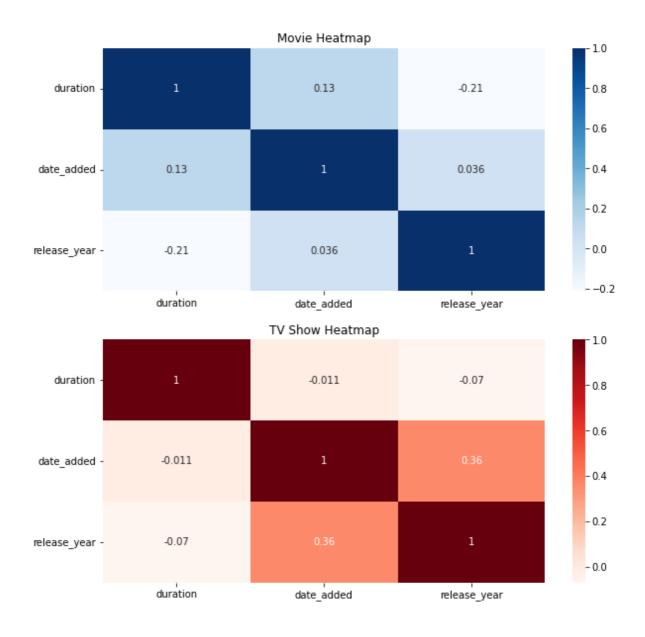
```
plt.bar(count_movies.rating, count_shows.title, bottom=count_movies.title)
plt.legend(['TV Shows', 'Movies'])
plt.show()
```

C:\Users\Mrudul\AppData\Local\Temp\ipykernel_1604\1319774375.py:3: FutureWarning: The frame.append method is deprecated and will be removed from pandas in a future version. Use pandas.concat instead.

count_shows = count_shows.append(



```
In [434... fig, axs = plt.subplots(nrows = 2, ncols = 1, figsize=(10, 4))
    heatmap_df_movie = movies[['duration', 'date_added', 'release_year']].drop_duplicatheatmap_df_movie["date_added"] = heatmap_df_movie["date_added"].dt.yearheatmap_df_movie["release_year"] = heatmap_df_movie["release_year"].dt.yearheatmap_df_tv_show = tv_shows[['duration', 'date_added', 'release_year']].drop_duplicatheatmap_df_tv_show["date_added"] = heatmap_df_tv_show["date_added"].dt.yearheatmap_df_tv_show["release_year"] = heatmap_df_tv_show["release_year"].dt.yearheatmap_df_tv_show["release_year"].dt.yearheatmap(data = heatmap_df_movie.corr(), annot=True, cmap='Blues', ax = axs[0])title = "Movie Heatmap")
    sns.heatmap(data = heatmap_df_tv_show.corr(), annot=True, cmap='Reds', ax = axs[1]title = "TV Show Heatmap")
    plt.subplots_adjust(top = 2)    plt.show()
```

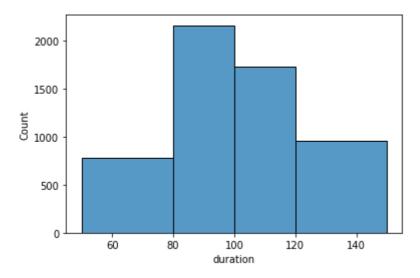


Business Insights

1.

```
In []:
```

Scaler Assignment Questions



```
movies["cast"][movies["country"] == "India"].value_counts()
In [527...
           Anupam Kher
                             102
Out[527]:
                             74
           Radhika Apte
           Paresh Rawal
                             73
          Shah Rukh Khan
                              73
          Akshay Kumar
                              70
          Amit Tandon
                               1
           Mousam
                               1
           Swapnil
                               1
           Arun Shekher
                               1
           Rajesh Kawa
          Name: cast, Length: 3797, dtype: int64
          temp["genre"] = data["listed_in"].str.split(", ").explode()
In [592...
          temp.str.contains("Comed").sum()
          2654
Out[592]:
          japanese_data = data[data["country"] == "Japan"]
In [711...
          japanese_data["listed_in"].str.split(", ").explode("listed_in").value_counts()
```

```
International TV Shows
                                          141
Out[711]:
                                          131
          Anime Series
          International Movies
                                          58
          Anime Features
                                          54
          Action & Adventure
                                           46
          Romantic TV Shows
                                           21
          TV Dramas
                                           20
          Crime TV Shows
                                           15
          Teen TV Shows
                                           14
          Kids' TV
                                           13
          Dramas
                                           12
          Children & Family Movies
                                           10
          TV Comedies
                                            7
          Reality TV
                                            6
          Sci-Fi & Fantasy
                                            6
          TV Thrillers
                                            5
                                            4
          TV Horror
          TV Action & Adventure
                                            4
          TV Mysteries
                                            4
          Music & Musicals
                                            3
          Thrillers
                                            3
                                            3
          Romantic Movies
          Horror Movies
                                            2
          LGBTQ Movies
                                            1
          Docuseries
                                            1
          Movies
                                            1
          Classic Movies
                                            1
          TV Shows
                                            1
          Stand-Up Comedy & Talk Shows
          Name: listed_in, dtype: int64
In [709... temp = tv_shows.dropna("director", axis = 1)
```

Out[709]:		show_id	type	title	director	cast	country	date_added	release_year	rating
	1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	24-09-2021	2021	TV- MA
	1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	24-09-2021	2021	TV- MA
	1	s2	TV Show	Blood & Water	NaN	Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban	South Africa	24-09-2021	2021	TV- MA
	2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	NaN	24-09-2021	2021	TV- MA
	2	s3	TV Show	Ganglands	Julien Leclercq	Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi	NaN	24-09-2021	2021	TV- MA
	8800	s8801	TV Show	Zindagi Gulzar Hai	NaN	Sanam Saeed, Fawad Khan, Ayesha Omer, Mehreen	Pakistan	15-12-2016	2012	TV-PG
	8800	s8801	TV Show	Zindagi Gulzar Hai	NaN	Sanam Saeed, Fawad Khan, Ayesha Omer, Mehreen	Pakistan	15-12-2016	2012	TV-PG
	8803	s8804	TV Show	Zombie Dumb	NaN	NaN	NaN	01-07-2019	2018	TV-Y7
	8803	s8804	TV Show	Zombie Dumb	NaN	NaN	NaN	01-07-2019	2018	TV-Y7

	show_id	type	title	director	cast	country	date_added	release_year	rating
8803	s8804	TV Show	Zombie Dumb	NaN	NaN	NaN	01-07-2019	2018	TV-Y7

6133 rows × 11 columns

In []: