## **Streaming company**

#### Netflix, Amazon Prime and Disney + Movies and TV Shows

Current sprint: 1

## **Objectives**

After completing this notebook we will be able to:

· Offer to streaming company best products to offer

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## **Explore data:**

```
In [1]: import pandas as pd
import numpy as np
import plotly.express as px
import re
```

```
In [2]: df = pd.read_csv('archive/netflix_titles.csv')
```

```
In [3]: def print_details(df):
            print(df.info())
            print("*" * 50)
            print(df.describe())
            print("*" * 50)
            print(df.isnull().sum().sort_values())
        def plot by cats(df):
            for cat in ['type','country', 'rating', 'release_year', 'rating', 'duration', 'listed_in']:
                fig = px.histogram(df, x=cat, barmode='group',title=f'Count plot for given {cat}', height=700)
                fig.show()
        def get_num_artist(df):
            df_artist = df['cast'].str.split(',', expand = True)#.fillna('notFound')
            df_artist.columns = ['artist_{}'.format(col) for col in df_artist.columns]
            df['num_artist'] = df_artist.count(axis=1)
            return df
        def date_columns_for_df(df):
            df['date_added'] = pd.to_datetime(df['date_added'])
            df['year'] = df['date_added'].dt.year
            df['month'] = df['date_added'].dt.month
            df['day'] = df['date_added'].dt.day
            return df
        def create_range_for_movies(time_movie):
            if (time_movie < 60):</pre>
                 return 'A'
            elif (time_movie >= 60) & (time_movie <= 90):</pre>
                return 'B'
            elif (time_movie > 90) & (time_movie <= 120):</pre>
                return 'C'
            else: return 'D'
        def create_range_for_seasons(seasons):
            if (seasons < 3):</pre>
                return 'E'
            elif (seasons >= 3) & (seasons <= 7):</pre>
                return 'F'
            elif (seasons > 7) & (seasons <= 10):</pre>
                return 'G'
            else: return 'H'
        def create_ranges(duration):
            if ('min' in duration):
                duration = int(re.findall("\d+", duration)[0])
                return create_range_for_movies(duration)
            elif (('Season' in duration) or ('Seasons' in duration)):
                duration = int(re.findall("\d+", duration)[0])
                return create_range_for_seasons(duration)
                return 'nan'
```

```
show id
           show_id 8807 non-null
type 8807 non-null
                       8807 non-null
                                      object
           title
                       8807 non-null
        2
                                      object
           director
                       6173 non-null object
        3
                      7982 non-null
        4
           cast
                                       object
        5
           country
                       7976 non-null
                                       object
           date_added 8797 non-null
        6
                                       object
           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
       ******************
             release_year
       count
             8807.000000
              2014.180198
       mean
       std
               8.819312
              1925.000000
       min
       25%
              2013.000000
       50%
              2017.000000
       75%
              2019.000000
       max
              2021.000000
                   0
       show_id
                        0
       type
       title
                        0
       release_year
       listed_in
       description
                        0
       duration
       rating
       date_added
                       10
       cast
                      825
       country
                      831
       director
                      2634
       dtype: int64
In [5]: plot_by_cats(df)
```

## **Data Cleaning and task To-Do:**

#### **Comments init:**

In [4]: print\_details(df)

# Column

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

Non-Null Count Dtype

- · There are more movies than tv shows
- · show\_id is id from row
- there are 2 types of media : serie or movie
- · For series duration measure is season, for movie minutes

#### **Commnets version 3**

- · We can analyze tv shows
- · We will analyze Prime data, on kaggle there's a similar data like Netflix

#### Tasks todo

- · Create range for duration
- · change date format
- · Count num of artist in casting

```
In [6]: df = get_num_artist(df)
 In [7]: df = date_columns_for_df(df)
 In [8]:
           df[df.duration.isnull()]
 Out[8]:
                  show_id
                                      title
                                            director
                                                     cast
                                                           country
                                                                    date_added release_year rating
                                                                                                     duration
                                                                                                             listed_in
                                                                                                                             description num_artist
                             type
                                                                                                                         Louis C.K. muses
                                     Louis
                                              Louis
                                                     Louis
                                                             United
                                                                     2017-04-04
                                                                                                                                                  1 201
            5541
                     s5542 Movie
                                      CK
                                                                                        2017
                                                                                                         NaN
                                                                                                                Movies
                                                                                                                        on religion, eternal
                                               C.K.
                                                     C.K.
                                                             States
                                      2017
                                                                                                                                love, gi...
                                                                                                                           Emmy-winning
                                     Louis
                                              Louis Louis
                                                             United
                                                                                                 84
                                                                                                                            comedy writer
            5794
                     s5795 Movie
                                                                     2016-09-16
                                                                                        2010
                                                                                                                                                  1 201
                                      C.K.:
                                                                                                         NaN
                                                                                                                Movies
                                               C.K.
                                                     C.K.
                                                             States
                                                                                                min
                                                                                                                         Louis C.K. brings
                                   Hilarious
                                     Louis
                                      C.K.:
                                                                                                                           The comic puts
                                              Louis Louis
                                                                                                 66
                                    Live at
                                                             United
            5813
                     s5814 Movie
                                                                     2016-08-15
                                                                                        2015
                                                                                                         NaN
                                                                                                                Movies
                                                                                                                            his trademark
                                                                                                                                                  1 201
                                               C.K.
                                                             States
                                       the
                                                     C.K.
                                                                                                min
                                                                                                                        hilarious/thought...
                                   Comedy
 In [9]:
          df.loc[df.duration.isnull(), 'duration'] = df.loc[df.duration.isnull(), 'rating']
In [10]: df['duration_range'] = [create_ranges(duration) for duration in df.duration]
```

#### Data cleaning after first analytics

In [16]: df = pd.read\_csv('archive/amazon\_prime\_titles.csv') df.tail(4)

#### Out[16]:

	show_id	type	title	director	cast	country	date_added	release_year	rating	duration	listed_in	description
9664	s9665	TV Show	Planet Patrol	NaN	DICK VOSBURGH, RONNIE STEVENS, LIBBY MORRIS, M	NaN	NaN	2018	13+	4 Seasons	TV Shows	This is Earth, 2100AD - and these are the adve
9665	s9666	Movie	Outpost	Steve Barker	Ray Stevenson, Julian Wadham, Richard Brake, M	NaN	NaN	2008	R	90 min	Action	In war-torn Eastern Europe, a world-weary grou
9666	s9667	TV Show	Maradona: Blessed Dream	NaN	Esteban Recagno, Ezequiel Stremiz, Luciano Vit	NaN	NaN	2021	TV- MA	1 Season	Drama, Sports	The series tells the story of Diego Maradona, 
9667	s9668	Movie	Harry Brown	Daniel Barber	Michael Caine, Emily Mortimer, Joseph Gilgun,	NaN	NaN	2010	R	103 min	Action, Drama, Suspense	Harry Brown, starring two-time Academy Award w

#### In [17]: print\_details(df)

<class 'pandas.core.frame.DataFrame'> RangeIndex: 9668 entries, 0 to 9667 Data columns (total 12 columns):

#	Column	Non-Null Count	Dtype
0	show_id	9668 non-null	object
1	type	9668 non-null	object
2	title	9668 non-null	object
3	director	7586 non-null	object
4	cast	8435 non-null	object
5	country	672 non-null	object
6	date_added	155 non-null	object
7	release_year	9668 non-null	int64
8	rating	9331 non-null	object
9	duration	9668 non-null	object
10	listed_in	9668 non-null	object
11	description	9668 non-null	object
4+	oc. int(1/1)	ab = a a + (11)	

dtypes: int64(1), object(11) memory usage: 906.5+ KB

None

\*\*\*\*\*\*\*\*\*\*\*\*\*

release\_year count 9668.000000 2008.341849 mean 18.922482 std 1920.000000 min 25% 2007.000000 50% 2016.000000 75% 2019.000000

2021.000000 max \*\*\*\*\*\*\*\*\*\*\*\*\*\*

show\_id 0 0 type 0 title release\_year 0 duration 0 listed in 0 description 0 337 rating 1233 cast director 2082 8996 country date\_added 9513

dtype: int64

```
In [18]: |plot_by_cats(df)
                 Count plot for given type
                 8000
                 7000
                 6000
                 5000
In [19]: | df = get_num_artist(df)
          df = date_columns_for_df(df)
In [20]: df[df.duration.isnull()]
Out[20]:
            show_id type title director cast country date_added release_year rating duration listed_in description num_artist year month day
In [21]: |df['duration_range'] = [create_ranges(duration) for duration in df.duration]
          df['show_id'] = df['show_id'].str[1:]
          df = df[df['release_year'] != 2021]
In [22]: df_prime = df.copy()
In [23]: |df_prime.loc[:,'data_source'] = 'Prime'
In [24]: df_netflix.shape, df_prime.shape
Out[24]: ((8215, 18), (8226, 18))
In [25]: df_prime.groupby('type').count()
Out[25]:
                 show_id
                          title director cast country date_added release_year rating duration listed_in description num_artist year month day
            type
           Movie
                    6675
                         6675
                                  6463 6048
                                                528
                                                            16
                                                                      6675
                                                                            6357
                                                                                    6675
                                                                                             6675
                                                                                                        6675
                                                                                                                  6675
                                                                                                                         16
                                                                                                                                16
                                                                                                                                    16
             TV
                    1551 1551
                                    0 1155
                                                 85
                                                            86
                                                                      1551
                                                                            1549
                                                                                    1551
                                                                                             1551
                                                                                                        1551
                                                                                                                  1551
                                                                                                                         86
                                                                                                                               86
                                                                                                                                    86
In [26]: df_prime.listed_in
Out[26]: 0
                             Comedy, Drama
                     Drama, International
          2
                  Action, Drama, Suspense
          3
                               Documentary
          4
                            Drama, Fantasy
          9661
                                  TV Shows
          9663
                                    Comedy
          9664
                                  TV Shows
          9665
                                    Action
          9667
                  Action, Drama, Suspense
          Name: listed_in, Length: 8226, dtype: object
```

#### **Concat Netflix + Prime**

```
In [27]: df_final = pd.concat([df_netflix,df_prime], ignore_index = True)
         Netflix Revenue
In [28]: df = pd.read_csv('archive/DataNetflixRevenue2020_V2.csv')
In [29]: print_details(df)
         <class 'pandas.core.frame.DataFrame'>
         RangeIndex: 40 entries, 0 to 39
         Data columns (total 3 columns):
             Column
                      Non-Null Count Dtype
          0
             Area
                      40 non-null
                                      object
                      40 non-null
                                      object
          1
             Years
             Revenue 40 non-null
                                      int64
         dtypes: int64(1), object(2)
         memory usage: 1.1+ KB
                     Revenue
         count 4.000000e+01
               1.176952e+09
         mean
               8.246170e+08
         std
         min
               1.991170e+08
         25%
               5.567758e+08
         50%
               8.400510e+08
         75%
               1.913442e+09
               2.839670e+09
         max
         ***************
                   0
         Area
         Years
                   0
         Revenue
                   0
         dtype: int64
In [30]: df['Quarter'] = df['Years'].str.split('-',expand = True)[0]
In [31]: | df['Year'] = df['Years'].str.split('-',expand = True)[1]
In [32]: | df.head(1)
Out[32]:
                          Area
                                  Years
                                          Revenue Quarter Year
         0 United States and Canada Q1 - 2018 1976157000
                                                      Q1 2018
In [33]: df.to_csv('netflix_revenue.csv', index=None)
```

#### **Disney plus**

In [34]: df = pd.read csv('archive/disney plus titles.csv') df.tail(2)

#### Out[34]:

•		show_id	type	title	director	cast	country	date_added	release_year	rating	duration	listed_in	description
	1448	s1449	Movie	Bend It Like Beckham	Gurinder Chadha	Parminder Nagra, Keira Knightley, Jonathan Rhy	United Kingdom, Germany, United States	September 18, 2020	2003	PG- 13	112 min	Buddy, Comedy, Coming of Age	Despite the wishes of their traditional famili
	1449	s1450	Movie	Captain Sparky vs. The Flying Saucers	Mark Waring	Charlie Tahan	United States	April 1, 2020	2012	TV-G	2 min	Action- Adventure, Animals & Nature, Animation	View one of Sparky's favorite home movies.

```
In [35]: df.type.unique()
Out[35]: array(['Movie', 'TV Show'], dtype=object)
In [36]: print_details(df)
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 1450 entries, 0 to 1449
        Data columns (total 12 columns):
                      Non-Null Count Dtype
        # Column
        ---
                        -----
        0
            show_id 1450 non-null object
         1
            type
                       1450 non-null object
           title
                       1450 non-null object
         3
           director 977 non-null
                                      object
         4
           cast
                       1260 non-null object
         5 country
                       1231 non-null object
           date_added 1447 non-null object
         6
         7
           release_year 1450 non-null int64
                        1447 non-null
         8
           rating
                                      object
         9
            duration
                        1450 non-null
                                      object
         10 listed_in
                        1450 non-null
                                      object
         11 description 1450 non-null
                                      object
        dtypes: int64(1), object(11)
        memory usage: 136.1+ KB
        None
        ****************
              release year
              1450.000000
        count
        mean
               2003.091724
               21.860162
        std
        min
               1928.000000
        25%
              1999.000000
        50%
               2011.000000
        75%
               2018.000000
               2021.000000
        max
        ******************
        show_id
                       0
        type
        title
        release_year
        duration
        listed_in
        description
        date_added
                       3
                       3
        rating
                      190
        cast
                      219
        country
        director
                      473
        dtype: int64
In [37]: |plot_by_cats(df)
             Count plot for given type
             1000
              800
```

In [38]: df['duration\_range'] = [create\_ranges(duration) for duration in df.duration]

```
In [39]: df = get_num_artist(df)
          df = date_columns_for_df(df)
In [40]: df['show_id'] = df['show_id'].str[1:]
          df = df[df['release_year'] != 2021]
In [41]: df_disney = df.copy()
          df_disney.loc[:,'data_source'] = 'Disney+'
In [42]: |df_final = pd.concat([df_final,df_disney], ignore_index = True)
In [43]: |df_final.to_csv('df_netflix_prime_disney.csv', index = None)
          print('guardado')
          guardado
In [44]: | df_final.groupby(['release_year', 'data_source']).count()
Out[44]:
                                     show_id type
                                                    title director cast country date_added rating duration listed_in description num_artist year
           release year data source
                                           3
                                                                                         0
                                                                                                3
                                                                                                                  3
                                                                                                                             3
                                                                                                                                        3
                                                                                                                                              0
                  1920
                              Prime
                                                3
                                                      3
                                                               3
                                                                    3
                                                                             0
                                                                                                         3
                                                                                                                             2
                  1922
                              Prime
                                           2
                                                 2
                                                      2
                                                               2
                                                                     2
                                                                             0
                                                                                         0
                                                                                                2
                                                                                                         2
                                                                                                                  2
                                                                                                                                        2
                                                                                                                                              0
                  1923
                              Prime
                                                      1
                                                                             0
                                                                                         0
                  1924
                              Prime
                                                      1
                                                                             0
                                                                                         0
                                                                                                                                              0
                                                                    0
                  1925
                             Netflix
                                           1
                                                 1
                                                      1
                                                               0
                                                                             0
                                                                                         1
                                                                                                1
                                                                                                         1
                                                                                                                  1
                                                                                                                             1
                                                                                                                                        1
                                                                                                                                              1
                     ...
                                                                            ...
                                                                                               ...
                                                                                                        ...
                                                               ...
                             Netflix
                  2019
                                        1030
                                              1030
                                                   1030
                                                             629
                                                                  917
                                                                           913
                                                                                      1030
                                                                                             1030
                                                                                                      1030
                                                                                                               1030
                                                                                                                           1030
                                                                                                                                      1030
                                                                                                                                           1030
                              Prime
                                         929
                                              929
                                                    929
                                                             691
                                                                  735
                                                                           111
                                                                                        12
                                                                                              899
                                                                                                       929
                                                                                                                929
                                                                                                                           929
                                                                                                                                      929
                                                                                                                                             12
                  2020
                            Disney+
                                         114
                                               114
                                                    114
                                                              53
                                                                   88
                                                                            90
                                                                                       114
                                                                                              114
                                                                                                       114
                                                                                                                114
                                                                                                                           114
                                                                                                                                       114
                                                                                                                                            114
                             Netflix
                                         953
                                              953
                                                    953
                                                             548
                                                                  827
                                                                           852
                                                                                       953
                                                                                              953
                                                                                                       953
                                                                                                                953
                                                                                                                           953
                                                                                                                                      953
                                                                                                                                            953
                              Prime
                                         962
                                              962
                                                    962
                                                             705
                                                                  838
                                                                            91
                                                                                        12
                                                                                              923
                                                                                                       962
                                                                                                                962
                                                                                                                           962
                                                                                                                                      962
                                                                                                                                             12
          261 rows × 16 columns
```

```
<class 'pandas.core.frame.DataFrame'>
 RangeIndex: 17766 entries, 0 to 17765
Data columns (total 18 columns):
  # Column Non-Null Count Dtype
 7 release_year 17766 non-null int64
8 rating 17441 non-null object
9 duration 17766 non-null object
10 listed_in 17766 non-null object
11 description 17766 non-null object
12 num_artist 17766 non-null int64
13 year 9629 non-null float64
14 month 9629 non-null float64
15 day 9629 non-null float64
16 duration_range 17766 non-null object
17 data_source 17766 non-null object
dtypes: datetime64[ns](1) float64(3) int644
dtypes: datetime64[ns](1), float64(3), int64(2), object(12)
memory usage: 2.4+ MB
 ***************
              release_year num_artist year month
count 17766.000000 17766.000000 9629.000000 9629.000000 9629.000000
mean 2009.269278 5.785039 2018.860733 7.046318 12.362654

        std
        16.467833
        4.971170
        1.476173
        3.522221
        9.553479

        min
        1920.000000
        0.000000
        2008.000000
        1.000000
        1.000000

        25%
        2008.000000
        2.000000
        2018.000000
        4.000000
        2.000000

        50%
        2016.000000
        5.000000
        2019.000000
        7.000000
        12.000000

        75%
        2018.000000
        8.000000
        2020.000000
        10.000000
        20.000000

        max
        2020.000000
        76.000000
        2021.000000
        12.000000
        31.000000

 *************
show_id 0
                                 0
0
num_artist
description
listed_in
duration
duration_range 0
release_year 0
data_source 0
title 0
type
                          0
325
1912
4501
8137
8137
8137
                                      0
type
rating
cast
director
month
dav
                          8137
8137
date added
                                8360
country
```

## **Steps After Data cleaning and Tableau analisis:**

# De acuerdo al análisis expuesto en Tableau, haremos un sistema de recomendación de series entre las 3 fuentes

• De acuerdo a la descripción

dtype: int64

In [45]: print\_details(df\_final)

## Cosas por hacer

• eliminar columnas; director, cast, num artis, country, date added(y sus divisiones) mientras analizamos como llenarlas

```
In [46]: | df = df_final.dropna(how = 'any', subset =['cast','day','month','year','director'])
In [47]: | df.isna().sum()
Out[47]: show id
                             0
         type
         title
                             0
         director
                             a
                             0
         cast
                            298
         country
         date_added
                             0
         release_year
                             0
         rating
         duration
                             0
         listed in
                             0
         description
                             0
                             0
         num_artist
                             0
         year
         month
                              0
         dav
         duration_range
         data_source
         dtype: int64
         llenar con la moda country y rating
In [48]: | df.loc[:,'country'] = df.loc[:,'country'].fillna(df['country'].mode()[0])
         df.loc[:,'rating'] = df.loc[:,'rating'].fillna(df['rating'].mode()[0])
         C:\Users\Csanch05\AppData\Roaming\Python\Python37\site-packages\pandas\core\indexing.py:966: SettingWithCopyWarning:
         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#returnin
         g-a-view-versus-a-copy (https://pandas.pydata.org/pandas-docs/stable/user guide/indexing.html#returning-a-view-versu
         s-a-copy)
In [49]: df.shape
```

Out[49]: (6293, 18)

data\_source Disney+

Netflix

Prime

Out[50]:

In [50]: df.groupby('data\_source').count()

show\_id type

5444

16

833

5444

16

5444

16

5444

16

5444

16

5444

16

## Aquí sí vamos a usar Disney+ como producto recomendado, aunque en Tableau no se analizó su crecimiento de producciones creadas

833

5444

16

title director cast country date\_added release\_year rating duration listed\_in description num\_artist year

5444

16

833

5444

16

5444

16

5444

16

5444

16

833

5444

16

833

5444

16

```
In [51]: category_list = list(df['listed_in'].apply(lambda x: x.split(',')[0]).unique())
print(sorted(category_list))
```

['Action', 'Action & Adventure', 'Action-Adventure', 'Adventure', 'Animals & Nature', 'Animation', 'Anime Features', 'Anime Series', 'Anthology', 'Biographical', 'British TV Shows', 'Buddy', 'Children & Family Movies', 'Classic & Cult TV', 'Classic Movies', 'Comedies', 'Comedy', 'Coming of Age', 'Concert Film', 'Crime', 'Crime TV Shows', 'Cult Movies', 'Dance', 'Documentaries', 'Documentary', 'Docuseries', 'Drama', 'Dramas', 'Family', 'Fantasy', 'Horror', 'Horror Movies', 'Independent Movies', 'International Movies', 'International TV Shows', "Kids' TV", 'LGBTQ Movies', 'Movies', 'Music & Musicals', 'Musical', 'Reality TV', 'Romantic Movies', 'Sci-Fi & Fantasy', 'Sports', 'Stand-Up Comedy', 'Stand-Up Comedy & Talk Shows', 'TV Action & Adventure', 'TV Comedies', 'TV Horror', 'TV Shows', 'Thrillers']

#### Same values for:

- Action & Adventure', 'Action-Adventure' -> Action & Adventure
- 'Anime Features'. 'Anime Series' -> Anime Series
- 'Crime', 'Crime TV Shows' -> Crime
- 'Comedy', Comedies', 'TV Comedies' -> Comedy
- 'Drama', 'Dramas' -> Drama
- 'Music & Musicals'. 'Musical' -> Music & Musicals
- 'Stand-Up Comedy', 'Stand-Up Comedy & Talk Shows' -> Stand-Up Comedy & Talk Shows

```
In [52]: | df.loc[:,'category'] = df['listed in'].apply(lambda x: x.split(',')[0])
        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#returnin
        g-a-view-versus-a-copy (https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versu
        s-a-copy)
        C:\Users\Csanch05\AppData\Roaming\Python\Python37\site-packages\pandas\core\indexing.py:966: SettingWithCopyWarning:
        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#returnin
        g-a-view-versus-a-copy (https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versu
        s-a-copy)
'Anime Features': 'Anime Series',
         'Anime Series': 'Anime Series',
         'Crime': 'Crime',
         'Crime TV Shows':'Crime',
         'Comedy':'Comedy',
            'Comedies':'Comedy',
         'TV Comedies':'Comedy',
         'Drama':'Drama', 'Dramas':'Drama',
         'Music & Musicals': 'Music & Musicals', 'Musical': 'Music & Musicals',
         'Stand-Up Comedy & Talk Shows': 'Stand-Up Comedy'
In [54]: | df.loc[:,'category'] = df['category'].map(clean_cat_dict).fillna(df['category'])
In [55]: df1 = df.drop(columns = ['cast','day','month','year','num_artist','data_source','date_added','listed_in']).reset_inde
        df1.isnull().sum()
Out[55]: show_id
                        а
                        0
        type
        title
                        0
        director
        country
        release_year
        rating
        duration
                        0
        description
                        0
        duration_range
                        0
        category
        dtype: int64
```

## Recommendation system:

```
In [56]: from sklearn.feature extraction.text import TfidfVectorizer
         from sklearn.metrics.pairwise import linear_kernel
In [57]: | tfidf = TfidfVectorizer(stop_words = 'english')
In [58]: | features = ['title','director','rating','description','duration_range','category']
         filters = df1[features]
In [59]: def format_column(x):
             return str.lower(x.replace(" ",""))
         def create_soup(x): #
             return x['title'] + ' '+ x['director'] + ' ' +x['rating'] + ' ' + x['description'] + ' ' + x['duration_range'] +
In [60]: for f in features:
             filters.loc[:,f] = filters.loc[:,f].apply(format_column)
         C:\Users\Csanch05\AppData\Roaming\Python\Python37\site-packages\pandas\core\indexing.py:1048: SettingWithCopyWarnin
         g:
         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#returnin
         g-a-view-versus-a-copy (https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versu
         s-a-copy)
In [61]: filters.loc[:,'soup'] = filters.apply(create soup, axis = 1)
         C:\Users\Csanch05\AppData\Roaming\Python\Python37\site-packages\pandas\core\indexing.py:845: SettingWithCopyWarning:
         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#returnin
         g-a-view-versus-a-copy (https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versu
         s-a-copy)
         C:\Users\Csanch05\AppData\Roaming\Python\Python37\site-packages\pandas\core\indexing.py:966: SettingWithCopyWarning:
         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#returnin
         g-a-view-versus-a-copy (https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versu
         s-a-copy)
In [62]: tfidf_vector = tfidf.fit_transform(filters['soup'])
         coseno_similitud = linear_kernel(tfidf_vector,tfidf_vector)
         series = pd.Series(filters.index, index = filters['title'])
In [63]: def get_recomendation(title,coseno_similitud ):
             title = title.lower().replace(' ','')
             idx = series[title]
             sim_scores = list(enumerate(coseno_similitud[idx]))
             sim_scores = sorted(sim_scores, key = lambda x: x[1], reverse = True)
             top 2 = [i[0]  for i  in sim  scores[1:3]]
             others = [i[0] for i in sim_scores[3:]]
             top_2_df = df1.iloc[top_2]
             aux_df = df1.iloc[others]
             aux_df = aux_df.loc[aux_df['type'] == 'TV Show']
             return pd.concat([top_2_df,aux_df.head(8)], ignore_index = True)
```

## **Results:**

In [64]: get\_recomendation('Green Lantern',coseno\_similitud )

Out[64]:

	show_id	type	title	director	country	release_year	rating	duration	description	duration_range	category
0	6867	Movie	GoldenEye	Martin Campbell	United Kingdom, United States	1995	PG- 13	130	Pierce Brosnan takes his first turn as debonai	D	Action & Adventure
1	8414	Movie	The Mask of Zorro	Martin Campbell	United States, Germany, Mexico	1998	PG- 13	138	An aging Zorro passes the torch to a young suc	D	Action & Adventure
2	6811	TV Show	Frozen Planet	Alastair Fothergill	United Kingdom, United States, Spain, Germany,	2011	TV- PG	1	Go on a journey through the Arctic and Antarct	E	British TV Shows
3	4263	TV Show	Watership Down	Noam Murro	United Kingdom, Ireland, United States	2018	TV- PG	1	A warren of rabbits battles many threats on th	E	British TV Shows
4	7410	TV Show	Mars	Everardo Gout	United States	2018	TV- PG	2	Fact meets fiction in this docudrama chronicli	E	Docuseries
5	2406	TV Show	DC's Legends of Tomorrow	Rob Seidenglanz	United States	2020	TV-14	5	A mysterious "time master" from the future uni	F	TV Action & Adventure
6	7749	TV Show	Planet Earth: The Complete Collection	Alastair Fothergill	United Kingdom	2006	TV- PG	1	This landmark series transports nature lovers	E	British TV Shows
7	5112	TV Show	Myths & Monsters	Daniel Kontur	United Kingdom	2017	TV- PG	1	This documentary series takes us to the mythic	E	British TV Shows
8	7919	TV Show	Sadqay Tumhare	Ehtesham Uddin	Pakistan	2014	TV- PG	1	An arranged engagement between a village girl	E	International TV Shows
9	7865	TV Show	Revolting Rhymes	Jani Lachauer, Jakob Schuh	United Kingdom	2017	TV- PG	1	Popular fairy tales take on a darkly comic edg	E	British TV Shows

In [65]: get\_recomendation('Y Tu Mamá También',coseno\_similitud )

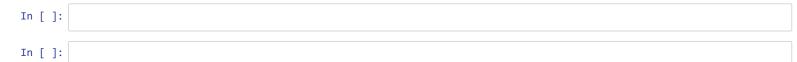
Out[65]:

	show_id	type	title	director	country	release_year	rating	duration	description	duration_range	category
0	8051	Movie	Solo Con Tu Pareja	Alfonso Cuarón	Mexico	1991	NR	94	A yuppie playboy looks for a quick death after	С	Comedy
1	4307	Movie	ROMA	Alfonso Cuarón	Mexico, United States	2018	R	135	Director Alfonso Cuarón delivers a vivid, emot	D	Drama
2	48	TV Show	The Smart Money Woman	Bunmi Ajakaiye	United States	2020	TV- MA	1	Five glamorous millennials strive for success	E	International TV Shows
3	149	TV Show	HQ Barbers	Gerhard Mostert	United States	2020	TV-14	1	When a family run barber shop in the heart of	E	TV Shows
4	317	TV Show	Office Girls	Hsu Fu-chun	Taiwan	2011	TV-14	1	A department store mogul has his son work inco	E	International TV Shows
5	588	TV Show	Quarantine Tales	Sidharta Tata, Aco Tenriyagelli, Dian Sastrowa	United States	2020	TV- MA	1	Traversing genres, five separate stories offer	E	International TV Shows
6	622	TV Show	Legend of Exorcism	Shen Leping	United States	2020	TV-14	1	After leaving Yaojin Palace, Kong Hongjun arri	E	Anime Series
7	667	TV Show	Gameboys Level- Up Edition	Ivan Andrew Payawal	United States	2020	TV-14	1	In this recut of the popular web series, live	E	International TV Shows
8	677	TV Show	Riverdale	Rob Seidenglanz	United States	2019	TV-14	4	While navigating the troubled waters of sex, r	F	Crime
9	682	TV Show	They've Gotta Have Us	Simon Frederick	United Kingdom	2018	TV- MA	1	Powered by candid recollections from esteemed	E	British TV Shows

## **Next Steps:**

- Try to add to soup country, and split it
- Model must be recommend cheapest series
- Get avg time subscription for user to analyze freq deploy new series

## Q&A



## **More Info**

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### **Change Log**

Date (YYYY-MM-DD)	Time (hh:mm)	Version	Changed By	Change Description
2020-05-11	08:23	5.1	Carlo	Clean notebook, add index and subtitles, export as pdf, add next steps
2020-05-11	08:06	5.0	Carlo	Clean notebook, and test with 2 movies
2020-05-11	07:58	4.5	Carlo	Recomendation workign, change en function split top2 + next top 8 series
2020-05-11	07:01	4.4	Carlo	Edit predict function
2020-05-10	22:21	4.3	Carlo	Add functions for Model tested and get better for next
2020-05-10	13:06	4.2	Carlo	Pause data cleaning, we clean category for df
2020-05-10	12:12	4.1	Carlo	Análisis para modelo
2020-05-09	14:21	4.0	Carlo	Add disney + as data source, cleaning process and concat netflix + prime + disney plus
2020-05-09	13:24	3.3	Carlo	split yers column to quarter and year
2020-05-09	12:53	3.2	Carlo	new Netflix revenue datasource
2020-05-08	20:07	3.1	Carlo	new columns for prime, we will take from netflix last analisis
2020-05-08	19:58	3.1	Carlo	join tables to get Netflix + Prime table, also change codelines to foo(s)
2020-05-08	19:11	3.0	Carlo	Change PrimeVideo as data source and add new one (similar as netflix)
2020-05-08	14:52	2.1	Carlo	Cleaning PrimeVideo and clean netflix to concat them
2020-05-08	13:53	2.0	Carlo	Add Prime video as datasource from kaggle and read main info
2020-05-08	11:10	1.2	Carlo	Drop data from release year 2021, it's incomplted
2020-05-08	08:40	1.1	Carlo	Explore data , create new columns for tableau
2020-05-06	19:20	1.0	Carlo	Get datascource from kaggle and read stuff

## Carlo Marmolejo

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