Investigate_a_Dataset

September 17, 2020

1 Explore IMDb movies data

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Introduction

The data set that we are dealing with is collected from The Movie Database (TMDb) and contains a lot of important information about more than 4000 movie. the data explains a lot of movies features and how it affect the success or failure of each one to observe the features that make a movie succeed and how can we determine its success.

Data Wrangling

In this section, we are going to load our data, explore it and clean it to make it ready for making our analysis and driving our observations from it.

1.1.1 Loading and explore data:

```
id
                                       homepage
0
                    http://www.avatarmovie.com/
                                                  19995
1
  http://disney.go.com/disneypictures/pirates/
                                                    285
    http://www.sonypictures.com/movies/spectre/
2
                                                  206647
             http://www.thedarkknightrises.com/
3
                                                  49026
4
           http://movies.disney.com/john-carter
                                                  49529
                                            keywords original_language
  [{"id": 1463, "name": "culture clash"}, {"id":...
  [{"id": 270, "name": "ocean"}, {"id": 726, "na...
                                                                     en
2 [{"id": 470, "name": "spy"}, {"id": 818, "name...
                                                                     en
3 [{"id": 849, "name": "dc comics"}, {"id": 853,...
                                                                     en
  [{"id": 818, "name": "based on novel"}, {"id":...
                                                                     en
                             original_title
0
                                     Avatar
1
  Pirates of the Caribbean: At World's End
2
                                    Spectre
3
                      The Dark Knight Rises
4
                                John Carter
                                            overview popularity
  In the 22nd century, a paraplegic Marine is di...
                                                      150.437577
1 Captain Barbossa, long believed to be dead, ha...
                                                      139.082615
2 A cryptic message from Bonds past sends him o... 107.376788
3 Following the death of District Attorney Harve...
                                                     112.312950
4 John Carter is a war-weary, former military ca...
                                                       43.926995
                                production_companies
0 [{"name": "Ingenious Film Partners", "id": 289...
  [{"name": "Walt Disney Pictures", "id": 2}, {"...
2 [{"name": "Columbia Pictures", "id": 5}, {"nam...
  [{"name": "Legendary Pictures", "id": 923}, {"...
         [{"name": "Walt Disney Pictures", "id": 2}]
                                production_countries release_date
                                                                      revenue
0 [{"iso_3166_1": "US", "name": "United States o...
                                                       2009-12-10
                                                                    2787965087
1 [{"iso_3166_1": "US", "name": "United States o...
                                                       2007-05-19
                                                                     961000000
2 [{"iso_3166_1": "GB", "name": "United Kingdom"...
                                                       2015-10-26
                                                                     880674609
3 [{"iso_3166_1": "US", "name": "United States o...
                                                       2012-07-16
                                                                    1084939099
4 [{"iso_3166_1": "US", "name": "United States o...
                                                       2012-03-07
                                                                     284139100
   runtime
                                             spoken_languages
                                                                 status
            [{"iso_639_1": "en", "name": "English"}, {"iso...
0
     162.0
                                                                Released
1
     169.0
                     [{"iso_639_1": "en", "name": "English"}]
                                                                Released
2
     148.0
            [{"iso_639_1": "fr", "name": "Fran\u00e7ais"},...
                                                                Released
3
     165.0
                     [{"iso_639_1": "en", "name": "English"}]
                                                                Released
```

```
[{"iso_639_1": "en", "name": "English"}] Released
                                                    tagline \
         0
                                Enter the World of Pandora.
           At the end of the world, the adventure begins.
         2
                                      A Plan No One Escapes
         3
                                            The Legend Ends
                      Lost in our world, found in another.
         4
                                                title vote_average vote_count
                                                                 7.2
         0
                                               Avatar
                                                                           11800
           Pirates of the Caribbean: At World's End
                                                                 6.9
                                                                            4500
         2
                                                                 6.3
                                                                            4466
                                              Spectre
         3
                                The Dark Knight Rises
                                                                 7.6
                                                                            9106
         4
                                          John Carter
                                                                 6.1
                                                                            2124
In [14]: # Knowing the data type of each column :
         df.dtypes
Out[14]: budget
                                    int64
         genres
                                   object
         homepage
                                   object
         id
                                    int64
                                   object
         keywords
         original_language
                                   object
         original_title
                                   object
         overview
                                   object
         popularity
                                  float64
         production_companies
                                   object
         production_countries
                                   object
         release_date
                                   object
         revenue
                                    int64
         runtime
                                  float64
         spoken_languages
                                   object
         status
                                   object
         tagline
                                   object
         title
                                   object
                                  float64
         vote_average
                                    int64
         vote_count
         dtype: object
In [15]: # Knowing if any column contains null values :
         df.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 4803 entries, 0 to 4802
Data columns (total 20 columns):
budget
                        4803 non-null int64
                        4803 non-null object
genres
```

132.0

```
1712 non-null object
homepage
id
                        4803 non-null int64
keywords
                        4803 non-null object
                         4803 non-null object
original_language
                         4803 non-null object
original_title
                         4800 non-null object
overview
popularity
                         4803 non-null float64
production_companies
                        4803 non-null object
production_countries
                        4803 non-null object
release_date
                        4802 non-null object
                        4803 non-null int64
revenue
                        4801 non-null float64
runtime
                        4803 non-null object
spoken_languages
                        4803 non-null object
status
tagline
                        3959 non-null object
                        4803 non-null object
title
vote_average
                        4803 non-null float64
vote_count
                        4803 non-null int64
dtypes: float64(3), int64(4), object(13)
memory usage: 750.5+ KB
In [17]: # Let's see the difference between original_title and title:
         sum(df['original_title'] == df['title'])
Out[17]: 4542
```

As shown above, 4542 movie has the same 'title' and 'original_title'. So, lets reduce redundancy and remove one of them. But now let's see some of the rows when title and original_title are difference:

```
In [18]: df[df['original_title'] != df['title']]
```

```
Out[18]:
                  budget
                                                                     genres \
         97
                15000000 [{"id": 28, "name": "Action"}, {"id": 12, "nam...
               130000000 [{"id": 12, "name": "Adventure"}, {"id": 14, "...
         215
                97250400 [{"id": 14, "name": "Fantasy"}, {"id": 12, "na...
         235
         317
                94000000 [{"id": 18, "name": "Drama"}, {"id": 36, "name...
         474
                         [{"id": 9648, "name": "Mystery"}, {"id": 18, "...
                86000000 [{"id": 12, "name": "Adventure"}, {"id": 14, "...
         488
                 8000000 [{"id": 35, "name": "Comedy"}, {"id": 16, "nam...
         492
                74500000 [{"id": 12, "name": "Adventure"}, {"id": 18, "...
         561
                65000000 [{"id": 28, "name": "Action"}, {"id": 18, "nam...
         678
         719
                60000000 [{"id": 10402, "name": "Music"}, {"id": 99, "n...
                         [{"id": 28, "name": "Action"}, {"id": 12, "nam...
         786
                68490000
                                              [{"id": 18, "name": "Drama"}]
                47000000
         861
         985
                60000000
                         [{"id": 12, "name": "Adventure"}, {"id": 18, "...
         1023
                                              [{"id": 18, "name": "Drama"}]
         1028
                         [{"id": 18, "name": "Drama"}, {"id": 878, "nam...
```

```
[{"id": 28, "name": "Action"}, {"id": 35, "nam...
1140
       33000000
                 [{"id": 12, "name": "Adventure"}, {"id": 35, "...
1142
                 [{"id": 53, "name": "Thriller"}, {"id": 18, "n...
1255
       42000000
                 [{"id": 35, "name": "Comedy"}, {"id": 10749, "...
1260
       10000000
1284
       40000000
                 [{"id": 28, "name": "Action"}, {"id": 18, "nam...
                 [{"id": 28, "name": "Action"}, {"id": 36, "nam...
1285
       25000000
                 [{"id": 12, "name": "Adventure"}, {"id": 16, "...
1287
       25000000
1298
       80341000
                 [{"id": 12, "name": "Adventure"}, {"id": 18, "...
                 [{"id": 28, "name": "Action"}, {"id": 18, "nam...
1304
        3860000
                 [{"id": 28, "name": "Action"}, {"id": 14, "nam...
1341
       36500000
                 [{"id": 28, "name": "Action"}, {"id": 18, "nam...
       36000000
1357
                 [{"id": 10752, "name": "War"}, {"id": 12, "nam...
1460
       35000000
                 [{"id": 16, "name": "Animation"}, {"id": 10751...
1471
       41677699
. . .
4434
         852510
                                      [{"id": 18, "name": "Drama"}]
4444
                                      [{"id": 18, "name": "Drama"}]
              0
         800000
                                      [{"id": 18, "name": "Drama"}]
4452
4457
                 [{"id": 18, "name": "Drama"}, {"id": 53, "name...
4459
                 [{"id": 18, "name": "Drama"}, {"id": 10769, "n...
                 [{"id": 27, "name": "Horror"}, {"id": 35, "nam...
4464
         800000
4474
         750000
                                      [{"id": 18, "name": "Drama"}]
4482
         700000
                                      [{"id": 18, "name": "Drama"}]
4500
                 [{"id": 53, "name": "Thriller"}, {"id": 9648, ...
                 [{"id": 18, "name": "Drama"}, {"id": 35, "name...
4505
                 [{"id": 35, "name": "Comedy"}, {"id": 18, "nam...
4510
4535
        2000000
                 [{"id": 28, "name": "Action"}, {"id": 18, "nam...
                                [{"id": 99, "name": "Documentary"}]
4536
4546
                 [{"id": 28, "name": "Action"}, {"id": 35, "nam...
              0
4573
                 [{"id": 10749, "name": "Romance"}, {"id": 18, ...
              0
4585
              0
                                     [{"id": 27, "name": "Horror"}]
4591
              0
                                      [{"id": 18, "name": "Drama"}]
              0
                                      [{"id": 18, "name": "Drama"}]
4605
                                     [{"id": 35, "name": "Comedy"}]
4609
              0
                 [{"id": 18, "name": "Drama"}, {"id": 53, "name...
4615
         300000
4672
         200000
                                    [{"id": 37, "name": "Western"}]
4677
                 [{"id": 10749, "name": "Romance"}, {"id": 18, ...
              0
              0
                                     [{"id": 27, "name": "Horror"}]
4684
                                [{"id": 99, "name": "Documentary"}]
4685
              0
                 [{"id": 18, "name": "Drama"}, {"id": 35, "name...
4695
         180000
4699
                                      [{"id": 18, "name": "Drama"}]
              0
4719
         120000
                 [{"id": 18, "name": "Drama"}, {"id": 10749, "n...
                 [{"id": 18, "name": "Drama"}, {"id": 10749, "n...
4751
                 [{"id": 18, "name": "Drama"}, {"id": 10769, "n...
4790
4792
                [{"id": 80, "name": "Crime"}, {"id": 27, "name...
                                                homepage
                                                               id \
```

[{"id": 28, "name": "Action"}, {"id": 18, "nam...

[{"id": 18, "name": "Drama"}, {"id": 12, "name...

```
97
                                                         NaN
                                                              315011
215
                                                         NaN
                                                                1979
235
      http://www.asterixauxjeuxolympiques.com/index.php
                                                                 2395
317
                    http://www.theflowersofwarmovie.com/
                                                               76758
                                                              330770
474
                                                         NaN
488
                                                         NaN
                                                                 9992
492
                                                         {\tt NaN}
                                                              293644
561
                                                         NaN
                                                                 1997
678
                                                         NaN
                                                              300168
                            http://www.thisisit-movie.com
719
                                                               13576
786
                            http://themonkeykingmovie.com
                                                              381902
861
                                                         NaN
                                                                 2841
985
                                                         NaN
                                                               10047
1023
                                                         NaN
                                                                7504
1028
                                                         NaN
                                                                  593
1095
                              http://ent.sina.com.cn/hjj/
                                                                 1494
1136
                                                         NaN
                                                                   79
1140
                                                         NaN
                                                               27936
1142
                  http://pourquoijaipasmangemonpere.com/
                                                               280391
1255
                                                         NaN
                                                               80278
1260
            http://www.die-fabelhafte-welt-der-amelie.de
                                                                  194
1284
                                                                14392
1285
                                                         NaN
                                                               19495
1287
                                                         NaN
                                                               77459
                              http://www.redclifffilm.com
1298
                                                                12289
1304
                                                               44865
1341
                                                               16911
                                         http://oostrov.ru
                                                              365222
1357
                                                         NaN
1460
                                                               11876
                                                         NaN
1471
                                                         NaN
                                                               12429
. . .
                                                                  . . .
4434
                                                         NaN
                                                                 2009
4444
                                                         {\tt NaN}
                                                              146882
4452
                                                         NaN
                                                               60243
4457
                                                                  905
                                                         NaN
4459
                                                         NaN
                                                               78705
4464
                                   http://www.deadsnow.com
                                                                14451
4474
                                                                8416
4482
      http://tartanvideo.com/film.asp?ProjectID={C66...
                                                                18734
4500
                                                              181940
                                                         NaN
4505
                                                         NaN
                                                              375950
4510
                                                              385636
                                                         NaN
4535
                                                         NaN
                                                                  346
4536
                            http://theotherdreamteam.com/
                                                               84318
4546
                                                               45380
         http://www.wie-im-himmel-derfilm.de/start.html
4573
                                                                  464
4585
                                                         NaN
                                                               19204
4591
                                                         NaN
                                                               10238
```

```
4605
                                 http://www.dogtooth.gr/
                                                            38810
4609
                                                     {\tt NaN}
                                                            11956
4615
                                                     NaN
                                                             2786
4672
                                                     NaN
                                                              391
4677
                                                     NaN
                                                            53256
4684
                                                      NaN
                                                           402515
4685
                                                          126141
4695
       http://www.miramax.com/movie/children-of-heaven/
                                                            21334
4699
                                                     NaN 344466
4719
                                                     NaN
                                                            40652
4751
                                                     NaN
                                                            42109
4790
                                                     NaN
                                                            13898
4792
                                                            36095
                                                      NaN
                                                keywords original_language \
97
      [{"id": 1299, "name": "monster"}, {"id": 7671,...
215
      [{"id": 657, "name": "fire"}, {"id": 720, "nam...
                                                                         en
235
      [{"id": 271, "name": "competition"}, {"id": 12...
                                                                         fr
      [{"id": 173251, "name": "forced prostitution"}...
317
                                                                         zh
      [{"id": 428, "name": "nurse"}, {"id": 658, "na...
474
                                                                         fr
488
      [{"id": 1158, "name": "grandfather grandson re...
                                                                         en
                          [{"id": 209714, "name": "3d"}]
492
                                                                         es
561
      [{"id": 380, "name": "brother brother relation...
                                                                         en
678
                                                                         zh
719
      [{"id": 3490, "name": "pop star"}, {"id": 6027...
                                                                         en
                [{"id": 207411, "name": "monkey king"}]
786
                                                                         zh
      [{"id": 90, "name": "paris"}, {"id": 549, "nam...
861
                                                                         fr
      [{"id": 222, "name": "schizophrenia"}, {"id": ...
985
                                                                         fr
      [{"id": 818, "name": "based on novel"}, {"id":...
1023
                                                                         hi
1028
      [{"id": 1228, "name": "1970s"}, {"id": 1565, "...
                                                                         ru
      [{"id": 351, "name": "poison"}, {"id": 478, "n...
1095
                                                                         zh
1136
     [{"id": 548, "name": "countryside"}, {"id": 10...
                                                                         zh
1140
      [{"id": 156052, "name": "unemployment"}, {"id"...
                                                                         fr
     [{"id": 10336, "name": "animation"}, {"id": 34...
1142
                                                                         fr
1255
      [{"id": 3434, "name": "thailand"}, {"id": 6941...
                                                                         en
      [{"id": 90, "name": "paris"}, {"id": 128, "nam...
1260
                                                                         fr
      [{"id": 782, "name": "assassin"}, {"id": 1402,...
1284
                                                                         zh
1285
                                                                         en
1287
      [{"id": 1299, "name": "monster"}, {"id": 10987...
                                                                         fr
      [{"id": 158145, "name": "flaming arrow"}, {"id...
1298
                                                                         zh
1304
      [{"id": 779, "name": "martial arts"}, {"id": 7...
                                                                         zh
      [{"id": 818, "name": "based on novel"}, {"id":...
1341
                                                                         ru
1357
                    [{"id": 5565, "name": "biography"}]
                                                                         cn
     [{"id": 924, "name": "italian"}, {"id": 1605, ...
1460
                                                                         en
     [{"id": 456, "name": "mother"}, {"id": 1357, "...
1471
                                                                         jа
. . .
                                                                        . . .
     [{"id": 570, "name": "rape"}, {"id": 922, "nam...
4434
                                                                         ro
4444 [{"id": 254, "name": "france"}, {"id": 2071, "...
                                                                         fr
```

```
4452
      [{"id": 1625, "name": "emigration"}, {"id": 60...
                                                                         fa
4457
      [{"id": 212, "name": "london england"}, {"id":...
                                                                         de
4459
                                                      П
                                                                         en
4464
      [{"id": 1191, "name": "norway"}, {"id": 10327,...
                                                                         no
      [{"id": 90, "name": "paris"}, {"id": 131, "nam...
4474
                                                                         it
4482
            [{"id": 10183, "name": "independent film"}]
                                                                         en
4500
                                                                         en
4505
      [{"id": 11612, "name": "hospital"}, {"id": 130...
                                                                         fr
     [{"id": 445, "name": "pornography"}, {"id": 57...
4510
                                                                         sl
      [{"id": 233, "name": "japan"}, {"id": 1462, "n...
4535
                                                                         jа
      [{"id": 2070, "name": "olympic games"}, {"id":...
4536
                                                                         en
4546
                                                                         zh
     [{"id": 30, "name": "individual"}, {"id": 240,...
4573
     [{"id": 612, "name": "hotel"}, {"id": 1706, "n...
4585
                                                                         it
      [{"id": 1156, "name": "sister sister relations...
4591
                                                                         sv
4605
     [{"id": 255, "name": "male nudity"}, {"id": 29...
                                                                         еl
4609
     [{"id": 90, "name": "paris"}, {"id": 977, "nam...
                                                                         fr
4615
     [{"id": 90, "name": "paris"}, {"id": 5918, "na...
                                                                         fr
4672
      [{"id": 2987, "name": "gang war"}, {"id": 4942...
                                                                         it
      [{"id": 572, "name": "sex"}, {"id": 154937, "n...
4677
                                                                         de
4684
      [{"id": 321, "name": "terror"}, {"id": 8087, "...
                                                                         pt
4685
                                                                         en
4695
      [{"id": 1155, "name": "brother sister relation...
                                                                         fa
4699
                                                                         ro
     [{"id": 1965, "name": "sandstorm"}, {"id": 151...
4719
                                                                         fr
4751
                                                      pt
4790
                                                      Π
                                                                         fa
4792
      [{"id": 233, "name": "japan"}, {"id": 549, "na...
                                                                         jа
                                          original_title \
97
215
                           4: Rise of the Silver Surfer
235
                            Astérix aux Jeux Olympiques
317
                                               Évolution
474
488
                                  Arthur et les Minimoys
492
                     Don Gato: El inicio de la pandilla
561
                                             Deux frères
678
719
                           Michael Jackson's This Is It
786
861
                        Un long dimanche de fiançailles
985
                                             Joan of Arc
                                             1947: Earth
1023
1028
1095
1136
1140
                                 Micmacs à tire-larigot
```

1142	Pourquoi j'ai pas mangé mon père		
1255	Lo imposible		
1260	Le fabuleux destin d'Amélie Poulain		
1284			
1285	Nomad		
1287	Un monstre à Paris		
1298	Chi bi		
1304			
1341	Obitaemyy Ostrov		
1357	3		
1460	Le Hussard sur le toit		
1471			
	• • •		
4434	4 luni, 3 sptmîni i 2 zile		
4444	Le bonheur d'Elza		
4452			
4457	Die Büchse der Pandora		
4459	Cama adentro		
4464	Død snø		
4474	Il conformista		
4482	L.I.E. Long Island Expressway		
4500	Arnolds Park		
4505	Médecin de campagne		
4510	Julija in Alfa Romeo		
4535			
4536	Kita svajoni komanda		
4546			
4573	Så som i himmelen		
4585	E tu vivrai nel terrore! L'aldilà		
4591	Viskningar och rop		
4605			
4609	Chacun Cherche Son Chat		
4615	Pierrot le fou		
4672	Per un pugno di dollari		
4677	Drei		
4684	Solitude		
4685	Chats perchés		
4695	<u>.</u>		
4699	Lumea e a mea		
4719	Une femme mariée: Suite de fragments d'un film		
4751	Gabriela, Cravo e Canela		
4790			
4792			
			,
07	Overview	popularity	\
97	From the mind behind Evangelion comes a hit la	9.476999	
215	The Fantastic Four return to the big screen as	60.810723	
235	Astérix and Obélix have to win the Olympic Gam	20.344364	

```
317
      A Westerner finds refuge with a group of women...
                                                           12.516546
474
      11-year-old Nicolas lives with his mother in a...
                                                            3.300061
488
      Arthur is a spirited ten-year old whose parent...
                                                           27.097932
492
      Top Cat has arrived to charm his way into your...
                                                            0.719996
561
      Two tigers are separated as cubs and taken int...
                                                            8.884318
678
      Huo An, the commander of the Protection Squad ...
                                                            9.568884
719
      A compilation of interviews, rehearsals and ba...
                                                           15.798622
786
      Taking place 500 years after the Havoc in Heav...
                                                            4.726290
861
      In 1919, Mathilde was 19 years old. Two years ...
                                                           23.054510
985
      In 1429 a teenage girl from a remote French vi...
                                                           21.084542
1023
      It's 1947 and the borderlines between India an...
                                                            1.246883
1028
      Ground control has been receiving strange tran...
                                                           24.132271
1095
      During China's Tang dynasty the emperor has ta...
                                                            9.950505
1136
      One man defeated three assassins who sought to...
                                                           23.607392
1140
      A man and his friends come up with an intricat...
                                                            7.663515
1142
      Based on the novel 'Evolution Man' by Roy Lewi...
                                                            5.794466
1255
      In December 2004, close-knit family Maria, Hen...
                                                           47.559928
1260
      At a tiny Parisian café, the adorable yet pain...
                                                           73.720244
1284
      A heroic tale of three blood brothers and thei...
                                                            6.884467
1285
      The Nomad is a historical epic set in 18th-cen...
                                                            8.212018
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      Paris, 1910. Emile, a shy movie projectionist, ...
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      In the early third century, the land of Wu is ...
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1304
      Ip Man's peaceful life in Foshan changes after...
                                                           19.947265
1341
      On the threshold of 22nd century, furrowing th...
                                                            2.785832
1357
      When a band of brutal gangsters led by a crook...
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      In a time of war and disease, a young officer ...
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1471
      The son of a sailor, 5-year old Sosuke lives a...
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      Gabita is pregnant, abortion is strictly forbi...
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      A young Parisian woman of Caribbean descent re...
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      A married couple are faced with a difficult de...
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      The rise and inevitable fall of an amoral but ...
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      Buenos Aires is in a deep recession. As the mo...
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      Eight medical students on a ski trip to Norway...
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      A weak-willed Italian man becomes a fascist fl...
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      In this biting and disturbing coming-of-age ta...
                                                            7.731064
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      When strangers Frank Delano and his Uncle Bobb...
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     All the people in this countryside area, can c...
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      Tilen (18), an attractive high school student,...
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      A samurai answers a village's request for prot...
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      The incredible story of the 1992 Lithuanian ba...
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      Three thieves try to steal a valuable jade tha...
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      A musical romantic tragedy about a famous comp...
                                                            4.321249
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      A young woman inherits an old hotel in Louisia...
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4591
      When a woman dying of cancer in turn-of-the ce...
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      Three teenagers are confined to an isolated co...
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      When Chloe (Garance Clavel), a young Parisian,...
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      Pierrot escapes his boring society and travels...
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The Man With No Name enters the Mexican villag...
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      Hanna and Simon are in a 20 year marriage with...
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      After finding an old storage locker filled wit...
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      Paris 2002. Yellow cats appear on the walls. C...
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4695
      Zohre's shoes are gone; her older brother Ali ...
                                                            7.072118
4699
      Larisa is 16 and lives in a city by the sea. I...
                                                            0.327622
      Charlotte is young and modern, not a hair out ...
                                                            1.112792
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      In 1925, Gabriela becomes cook, mistress, and ...
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      Various women struggle to function in the oppr...
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      A wave of gruesome murders is sweeping Tokyo. ...
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4672	Released In his own way he is perhaps, the most dangero Released Imagine the possibilities.		
4677	o r		
4684 4685	Released NaN		
4695	Released NaN Released A Little SecretTheir Biggest Adventure!		
4699	Released A Little SecretTheir Biggest Adventure! Released NaN		
4719 4751	Released She Loves Two Men She is Married to One! Released NaN		
4790	Released NaN		
4790	Released Madness. Terror. Murder.		
4132	Madness. Tellot. Mulder.		
	title vote_average vote_o	count	
97	Shin Godzilla 6.5	143	
215	Fantastic 4: Rise of the Silver Surfer 5.4	2589	
235	Asterix at the Olympic Games 5.0	471	
317	The Flowers of War 7.1	187	
474	Evolution 6.4	47	
488	Arthur and the Invisibles 6.0	639	
492	Top Cat Begins 5.3	9	
561	Two Brothers 6.9	180	
678	Dragon Blade 5.9	145	
719	This Is It 6.7	247	
786	The Monkey King 2 6.0	24	
861	A Very Long Engagement 7.1	346	
985	The Messenger: The Story of Joan of Arc 6.2	367	
1023	Earth 6.6	9	
1028	Solaris 7.7	357	
1095	Curse of the Golden Flower 6.6	203	
1136	Hero 7.2	635	
1140	Micmacs 6.8	148	
1142	Why I Did (Not) Eat My Father 5.3	125	
1255	The Impossible 7.0	2025	
1260	Amélie 7.8	3310	
1284	The Warlords 6.3	83	
1285	Nomad: The Warrior 4.3	17	
1287	A Monster in Paris 6.5	313	

1298	Red Cliff	7.1	205
1304	The Grandmaster	6.3	273
1341	The Inhabited Island	5.3	23
1357	Ip Man 3	6.5	379
1460	The Horseman on the Roof	6.7	25
1471	Ponyo	7.5	926
4434	4 Months, 3 Weeks and 2 Days	7.3	156
4444	Elza	0.0	0
4452	A Separation	7.7	469
4457	Pandora's Box	7.6	45
4459	Live-In Maid	7.8	3
4464	Dead Snow	6.1	311
4474	The Conformist	7.6	127
4482	L.I.E.	6.7	31
4500	Carousel of Revenge	0.0	0
4505	The Country Doctor	6.0	63
4510	Juliet and Alfa Romeo	6.0	1
4535	Seven Samurai	8.2	878
4536	The Other Dream Team	6.9	7
4546	Crazy Stone	6.9	22
4573	As It Is in Heaven	6.9	42
4585	The Beyond	6.6	117
4591	Cries and Whispers	7.8	115
4605	Dogtooth	6.9	332
4609	When the Cat's Away	6.1	16
4615	Pierrot le Fou	7.6	127
4672	A Fistful of Dollars	7.6	883
4677	Three	6.3	31
4684	American Beast	0.0	0
4685	The Case of the Grinning Cat	7.7	3
4695	Children of Heaven	7.8	112
4699	The World Is Mine	0.0	0
4719	The Married Woman	7.1	20
4751	Gabriela	6.0	2
4790	The Circle	6.6	17
4792	Cure	7.4	63

[261 rows x 20 columns]

As shown above, original_title column contains non English words that is not necessary for us. So, we are going to remove that column and keep 'title' column only.

1.1.2 Data Cleaning:

Removing unnecessary columns:

In [21]: # Removing 'original_title' column :

As we can see from the dataframe info, the column 'homepage' contains only 1712 values out of 4803 and the rest is null values. This is completely not enough that we are going to remove that column too.

```
In [22]: # Remove homepage column :
         df.drop('homepage' , axis=1 , inplace = True)
         df.shape
Out[22]: (4803, 18)
Filling null values:
In [23]: # Replace null values in Overview column with 'Not exist'
         df['overview'].fillna('Not exist' , inplace=True)
   Release_date column contains only one null value. So, lets see the whole row of that null value
In [25]: df[df['release_date'].isnull()]
Out[25]:
                                   id keywords original_language \
               budget genres
         4553
                    0
                           П
                              380097
                                             П
                                                          overview popularity \
               1971 post civil rights San Francisco seemed li...
              production_companies production_countries release_date revenue runtime \
         4553
                                                                   NaN
                                                       П
                                                                                      0.0
                                   status tagline
                                                                          title \
              spoken_languages
         4553
                                 Released
                                              {\tt NaN}
                                                   America Is Still the Place
               vote_average vote_count
         4553
                         0.0
```

As shown above, most of the values are missing with 'America Is Still the place' movie (that does not have realse date value), so it is better to remove the whole row

```
In [28]: # Replace null values in runtime column with its average :
         runtime_avg = df['runtime'].notna().mean()
         df['runtime'].fillna(runtime_avg , inplace=True)
/opt/conda/lib/python3.6/site-packages/pandas/core/generic.py:5434: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame
See the caveats in the documentation: http://pandas.pydata.org/pandas-docs/stable/indexing.html#
  self._update_inplace(new_data)
In [29]: df.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 4802 entries, 0 to 4802
Data columns (total 18 columns):
budget
                        4802 non-null int64
                        4802 non-null object
genres
                        4802 non-null int64
id
                        4802 non-null object
keywords
original_language
                        4802 non-null object
                        4802 non-null object
overview
                        4802 non-null float64
popularity
production_companies
                        4802 non-null object
                        4802 non-null object
production_countries
release_date
                        4802 non-null object
                        4802 non-null int64
revenue
                        4802 non-null float64
runtime
                        4802 non-null object
spoken_languages
                        4802 non-null object
status
tagline
                        3959 non-null object
title
                        4802 non-null object
                        4802 non-null float64
vote_average
vote_count
                        4802 non-null int64
dtypes: float64(3), int64(4), object(11)
memory usage: 712.8+ KB
In [30]: # Replace null values in tagline column with 'Not exist'
         df['tagline'].fillna('Not exist' , inplace=True)
/opt/conda/lib/python3.6/site-packages/pandas/core/generic.py:5434: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame
See the caveats in the documentation: http://pandas.pydata.org/pandas-docs/stable/indexing.html#
  self._update_inplace(new_data)
```

In [31]: df.info()

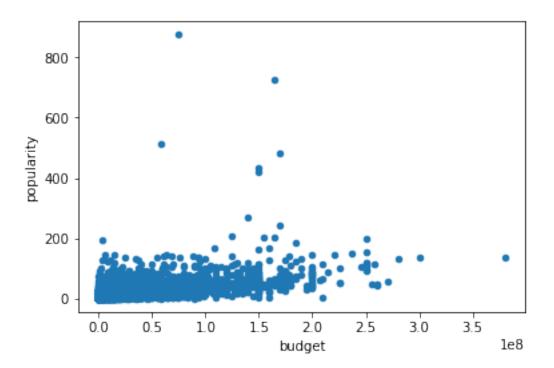
```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 4802 entries, 0 to 4802
Data columns (total 18 columns):
                        4802 non-null int64
budget
                        4802 non-null object
genres
                        4802 non-null int64
id
keywords
                        4802 non-null object
original_language
                        4802 non-null object
                        4802 non-null object
overview
                        4802 non-null float64
popularity
                        4802 non-null object
production_companies
production_countries
                        4802 non-null object
release_date
                        4802 non-null object
                        4802 non-null int64
revenue
                        4802 non-null float64
runtime
                        4802 non-null object
spoken_languages
status
                        4802 non-null object
                        4802 non-null object
tagline
title
                        4802 non-null object
vote_average
                        4802 non-null float64
                        4802 non-null int64
vote_count
dtypes: float64(3), int64(4), object(11)
memory usage: 712.8+ KB
```

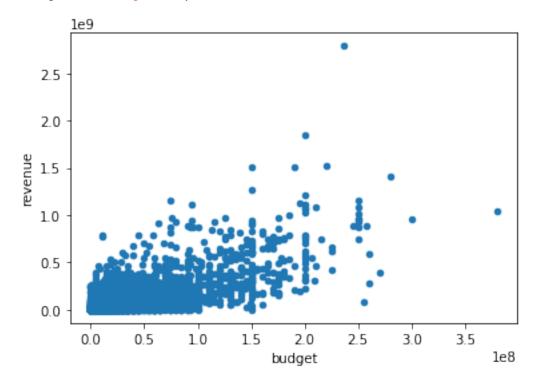
Exploratory Data Analysis

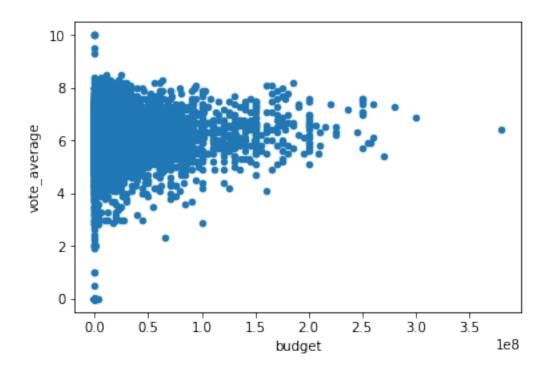
After cleaning our data, we're ready to move on to exploration. We are going to compute statistics and create visualizations so that we can analyse and answer some questions about the data.

1.1.3 How does the movie budget affect its success?

Let's plot the movies budget with the dependent features that determine the success of the movie (popularity, revenue and vote_avrage) and see if there is a clear relationship between the movie budget and any of that features:







Observation: As seen from the above three plots, the most feature that has a releationship with budget is the revenue. It is very clear that revenue is directly proportional to the movie budget.

While the other two plots show that there isn't a clear relationship between the movie budget and the popularity of the movie or its vote average. Some of the low budget movies got very high popularity that high budget movies did not get it. Also the vote average has a common range that is between 4 and 8 despite of how much the movie budget was.

1.1.4 How do movie budget and revenue change overtime?

Now, we want to see on average how much the money spent and gained from movies changed between the 20th and 21st centuries.

So, let's Order the movies by their release date and get the first movie came in the 21st century so that we can split the movies into before and after 2000 :

```
In [37]: # getting the first movie came in the 21st century
         df['release_date'] = pd.to_datetime(df['release_date'])
         release_date_sorted = pd.DataFrame(df['release_date'].sort_values())
         release_date_sorted.reset_index(inplace=True)
         release_date_sorted.drop('index',axis=1,inplace=True)
         release_date_sorted.iloc[1308,0]
/opt/conda/lib/python3.6/site-packages/ipykernel_launcher.py:3: 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: http://pandas.pydata.org/pandas-docs/stable/indexing.html#
 This is separate from the ipykernel package so we can avoid doing imports until
Out[37]: Timestamp('2000-01-01 00:00:00')
  Getting all the movies that came in the 20th century and obtaining their budget and revenue
averages:
In [38]: before_2000 = df.sort_values('release_date').iloc[0:1308,:];
         before_2000.shape
Out[38]: (1308, 18)
In [39]: print("average budget before 2000 : " , before_2000['budget'].mean())
         print("average revenue before 2000 : " , before_2000['revenue'].mean())
average budget before 2000 : 20843081.8677
average revenue before 2000 : 67828967.5673
  Getting all the movies that came in the 21th century and obtaining their budget and revenue
averages:
In [40]: after_2000 = df.sort_values('release_date').iloc[1308:,:];
         after_2000.shape
Out[40]: (3494, 18)
In [42]: print("average budget after 2000 : " , after_2000['budget'].mean())
         print("average revenue after 2000 : " , after_2000['revenue'].mean())
average budget after 2000 : 32123805.2198
average revenue after 2000 : 87686765.2736
```

Observation: We can see that the movies average budget and revenue in the 21st century increased by about 20 million over the movies in the 20th century and this is how the release date of the movie affects its budget and revenue.

1.1.5 Does the movies industry affected by the movie Original language?

Let's start by seeing how many original languages exist in the data set and the count of each movie category:

```
In [43]: df['original_language'].value_counts()
Out[43]: en
                 4504
          fr
                   70
          es
                   32
                   27
          zh
                   27
          de
          hi
                   19
                   16
          jа
          it
                   14
                   12
          cn
                   11
          ru
          ko
                   11
                    9
          pt
                    7
          da
                     5
          sv
                    4
          nl
          fa
                    4
          he
                    3
                    3
          th
                    2
          СS
                    2
          ro
                     2
          ar
                     2
          ta
                     2
          id
                     1
                     1
          pl
          hu
                    1
          tr
                     1
                     1
          xx
          te
                     1
                     1
          sl
          ps
                     1
                     1
          kу
                     1
          no
          af
                    1
                     1
          nb
          el
                     1
          is
          Name: original_language, dtype: int64
```

Most of the movies has English language. So, when we are driving observations about the movies budget and revenue according to their original language, we should look for the average, as the sum would definitly be at its highest value with English movies (which are 4504 movie).

```
In [45]: df.groupby('original_language').vote_count.mean().sort_values(ascending=False)
Out[45]: original_language
               719.183393
         en
               715.750000
         jа
         id
               632.500000
         ko
               588.818182
               583.000000
         nb
         da
               450.428571
         it
               403.928571
               332.000000
         pt
               321.44444
               311.000000
         no
         es
               301.875000
               260.000000
         pl
         de
               242.44444
         fr
               228.828571
               220.916667
         cn
               155.250000
               146.592593
               135.000000
         te
         he
               112.666667
               109.000000
         xx
         th
               108.333333
                95.181818
         ru
         af
                94.000000
                92.750000
         nl
         sv
                87,000000
                78.000000
         ro
                53.500000
         ar
                44.000000
         hi
         ps
                32.000000
                28.000000
         hu
                26.000000
                12.000000
         tr
                 7.000000
         ta
                 4.000000
                 1.000000
         sl
         vi
                 1.000000
                 0.00000
         kγ
         Name: vote_count, dtype: float64
In [46]: df.groupby('original_language').vote_average.mean().sort_values(ascending=False)
Out[46]: original_language
               7.500000
         te
         id
               7.400000
               7.400000
         he
```

```
7.300000
         ar
         nl
               7.175000
         da
               7.128571
         pl
               7.100000
               7.100000
         xx
         sv
               7.060000
         jа
               7.050000
               7.028571
         it
         af
                6.900000
                6.900000
         el
                6.900000
         is
                6.700000
         nb
                6.672727
         ko
         es
                6.659375
                6.500000
         hu
         cn
                6.500000
         fr
                6.430000
         pt
                6.388889
                6.354545
         de
                6.325926
         zh
                6.300000
         ps
                6.300000
                6.100000
         no
                6.067029
         en
               6.010526
         hi
                6.000000
         sl
         th
                5.966667
         ta
                5.850000
                5.650000
         СS
                5.000000
         vi
         tr
                4.300000
                3.650000
         ro
                0.00000
         kу
         Name: vote_average, dtype: float64
In [47]: df.groupby('original_language').budget.mean().sort_values(ascending=False)
Out[47]: original_language
                4.00000e+07
         te
                3.040111e+07
         en
         zh
               2.202560e+07
                1.429361e+07
         jа
                1.429091e+07
         ko
                1.397273e+07
         ru
                1.200000e+07
         xx
                1.072641e+07
         cn
                1.000000e+07
         tr
```

fa

7.375000

```
de
               8.616354e+06
               8.480997e+06
         fr
         nl
               7.375000e+06
               5.847683e+06
         es
               5.000000e+06
         th
               4.833333e+06
               3.500000e+06
         af
               3.000000e+06
               2.967859e+06
         it
         pl
               2.159280e+06
         hi
               1.715789e+06
               1.300000e+06
         vi
               1.133333e+06
         рt
               1.050000e+06
         id
               8.000000e+05
         no
         he
               6.66667e+05
               4.262550e+05
         ro
         fa
               2.450000e+05
               4.600000e+04
         ps
         is
               1.000000e+01
         el
               0.000000e+00
               0.000000e+00
               0.00000e+00
         ta
         СS
               0.000000e+00
               0.000000e+00
         sl
               0.000000e+00
         ar
               0.00000e+00
         kу
         Name: budget, dtype: float64
In [48]: df.groupby('original_language').revenue.mean().sort_values(ascending=False)
Out[48]: original_language
               1.000000e+08
         te
               8.649805e+07
         en
         jа
               6.602892e+07
               5.526056e+07
         хx
               4.173498e+07
         zh
         cn
               3.374016e+07
               2.989889e+07
         da
         ko
               2.535645e+07
               1.865218e+07
         es
               1.396191e+07
         de
         fr
               1.246151e+07
         th
               1.203408e+07
         рl
               1.070000e+07
         af
               9.879971e+06
               9.510074e+06
         ru
```

da

9.742857e+06

```
hi
      7.447231e+06
      6.680779e+06
nl
nb
      4.159678e+06
рt
      4.026498e+06
he
      3.708616e+06
      3.029494e+06
it
id
      2.274881e+06
no
      1.984662e+06
      6.390000e+05
vi
ro
      5.928915e+05
fa
      2.250000e+05
el
      1.101970e+05
is
      1.100000e+01
      0.000000e+00
hu
ta
      0.000000e+00
      0.000000e+00
SV
kу
      0.00000e+00
      0.000000e+00
ps
      0.000000e+00
tr
      0.000000e+00
CS
      0.000000e+00
ar
sl
      0.000000e+00
Name: revenue, dtype: float64
```

Observation: We can observe that there are movies with some specific languages (English and Japanese for example) that have highest budget, revenue and they are the most common movies to have the highest vote_count.

Also we can see that these movies are not the ones with the highest vote average because of that high vote counts.

Number of votes extremly affected by the original language of the movie. We can see that English movies have the largest number of votes (3239202 votes for all English movies), while the summation of total votes for movies with some languages are just less than 10 votes!

Conclusions

Finally, we can conclude that each movie success can be determined according to some variables. These variables depend on a lot of components that we actually can use to make indecations about whether ther movie would succeed or not before it is even published.