```
Import Libraries
In [1]:
          import numpy as np
In [2]:

    import pandas as pd

    import matplotlib.pyplot as plt

In [3]:
In [4]:
          import seaborn as sns
         Load the Data
          In [5]:
             df.head()
   Out[5]:
                                                  Genre Rating
                                 Year Duration
                                                                        Director
                                                                                  Actor 1
                                                                                             Actor 2
                                                                                                       Actor 3
                         Name
                                                               Votes
                                                                            J.S.
                                                                                                      Rajendra
              0
                                 NaN
                                          NaN
                                                                                 Manmauji
                                                                                               Birbal
                                                  Drama
                                                          NaN
                                                                 NaN
                                                                       Randhawa
                                                                                                        Bhatia
                    #Gadhvi (He
                                                                         Gaurav
                                                                                   Rasika
                                                                                               Vivek
                                                                                                        Arvind
              1
                  thought he was
                               (2019)
                                       109 min
                                                  Drama
                                                           7.0
                                                                   8
                                                                          Bakshi
                                                                                    Dugal
                                                                                           Ghamande
                                                                                                        Jangid
                        Gandhi)
                                                 Drama.
                                                                        Soumyajit
                                                                                   Sayani
                                                                                              Plabita
                                                                                                         Roy
              2
                   #Homecoming
                               (2021)
                                        90 min
                                                          NaN
                                                                 NaN
                                                 Musical
                                                                       Majumdar
                                                                                    Gupta
                                                                                            Borthakur
                                                                                                       Angana
                                                Comedy,
                                                                                                      Siddhant
              3
                       #Yaaram
                               (2019)
                                       110 min
                                                                  35
                                                                      Ovais Khan
                                                                                   Prateik
                                                                                            Ishita Raj
                                                           4.4
                                                Romance
                                                                                                       Kapoor
                     ...And Once
                                                                           Amol
                                                                                    Rajat
                                                                                            Rituparna
                                                                                                        Antara
                               (2010)
                                       105 min
                                                  Drama
                                                          NaN
                                                                 NaN
                         Again
                                                                         Palekar
                                                                                   Kapoor
                                                                                            Sengupta
                                                                                                         Mali
         Data Preprocessing
In [6]:
             #Number of Rows
             df.shape[0]
   Out[6]: 15509
            #Number of Columns
In [7]:
          H
             df.shape[1]
   Out[7]: 10
In [8]:

▶ print(df.columns.tolist()) #Number of Columns in List
             ['Name', 'Year', 'Duration', 'Genre', 'Rating', 'Votes', 'Director', 'Actor 1', 'Actor
             2', 'Actor 3']
```

```
#Missing values in Columns
In [9]:
             df.isnull().sum()
    Out[9]: Name
                            0
             Year
                          528
             Duration
                         8269
             Genre
                         1877
             Rating
                         7590
                         7589
             Votes
             Director
                          525
             Actor 1
                         1617
             Actor 2
                         2384
             Actor 3
                         3144
             dtype: int64
          ▶ #Total Number of Missing Values
In [10]:
             df.isnull().sum().values.sum()
   Out[10]: 33523
            #Unique Values
In [13]:
             df.nunique()
   Out[13]: Name
                         13838
             Year
                           102
             Duration
                           182
                           485
             Genre
             Rating
                            84
             Votes
                          2034
             Director
                          5938
             Actor 1
                          4718
             Actor 2
                          4891
             Actor 3
                          4820
             dtype: int64
In [14]:
          df.info()
             <class 'pandas.core.frame.DataFrame'>
             RangeIndex: 15509 entries, 0 to 15508
             Data columns (total 10 columns):
              #
                  Column
                            Non-Null Count Dtype
                            -----
              0
                            15509 non-null object
                  Name
              1
                  Year
                            14981 non-null object
              2
                  Duration 7240 non-null
                                            object
              3
                  Genre
                            13632 non-null object
              4
                  Rating
                            7919 non-null
                                            float64
              5
                  Votes
                            7920 non-null
                                            object
              6
                  Director 14984 non-null
                                            object
              7
                  Actor 1
                            13892 non-null
                                            object
              8
                  Actor 2
                            13125 non-null
                                            object
                  Actor 3
                           12365 non-null
                                            object
             dtypes: float64(1), object(9)
             memory usage: 1.2+ MB
```

```
In [15]:
          #actors value count
             df['Actor 1'].value_counts()
   Out[15]: Ashok Kumar
                                   158
             Dharmendra
                                   140
             Jeetendra
                                   140
             Mithun Chakraborty
                                   133
             Amitabh Bachchan
                                   129
             Vatsal Sheth
                                     1
             Ujala Baboria
                                     1
             Dimple Sewak
                                     1
             Komal Leels
                                     1
             Sangeeta Tiwari
                                     1
             Name: Actor 1, Length: 4718, dtype: int64
          # directors value count
In [16]:
             df['Director'].value_counts()
   Out[16]: Jayant Desai
                                 58
             Kanti Shah
                                 57
             Babubhai Mistry
                                 50
             Mahesh Bhatt
                                 48
             Master Bhagwan
                                 47
             Naeem Siddiqui
                                  1
             Shadaab Khan
                                  1
             Mystelle Brabbee
                                  1
             Kunal Shivdasani
                                  1
             Kiran Thej
                                  1
             Name: Director, Length: 5938, dtype: int64
In [17]:
          ▶ #genre value count
             df['Genre'].value_counts()
   Out[17]: Drama
                                           2780
             Action
                                           1289
             Thriller
                                            779
                                            708
             Romance
             Drama, Romance
                                            524
                                            . . .
             Action, Musical, War
                                              1
             Horror, Crime, Thriller
                                              1
             Animation, Comedy
                                              1
             Romance, Action, Crime
                                              1
             Adventure, Fantasy, Sci-Fi
                                              1
             Name: Genre, Length: 485, dtype: int64
```

In [18]: ► df.head(10)

Out[18]:

	Name	Year	Duration	Genre	Rating	Votes	Director	Actor 1	Actor 2	Actor 3
0		NaN	NaN	Drama	NaN	NaN	J.S. Randhawa	Manmauji	Birbal	Rajendra Bhatia
1	#Gadhvi (He thought he was Gandhi)	(2019)	109 min	Drama	7.0	8	Gaurav Bakshi	Rasika Dugal	Vivek Ghamande	Arvind Jangid
2	#Homecoming	(2021)	90 min	Drama, Musical	NaN	NaN	Soumyajit Majumdar	Sayani Gupta	Plabita Borthakur	Roy Angana
3	#Yaaram	(2019)	110 min	Comedy, Romance	4.4	35	Ovais Khan	Prateik	I shita Raj	Siddhant Kapoor
4	And Once Again	(2010)	105 min	Drama	NaN	NaN	Amol Palekar	Rajat Kapoor	Rituparna Sengupta	Antara Mali
5	Aur Pyaar Ho Gaya	(1997)	147 min	Comedy, Drama, Musical	4.7	827	Rahul Rawail	Bobby Deol	Aishwarya Rai Bachchan	Shammi Kapoor
6	Yahaan	(2005)	142 min	Drama, Romance, War	7.4	1,086	Shoojit Sircar	Jimmy Sheirgill	Minissha Lamba	Yashpal Sharma
7	in for Motion	(2008)	59 min	Documentary	NaN	NaN	Anirban Datta	NaN	NaN	NaN
8	?: A Question Mark	(2012)	82 min	Horror, Mystery, Thriller	5.6	326	Allyson Patel	Yash Dave	Muntazir Ahmad	Kiran Bhatia
9	@Andheri	(2014)	116 min	Action, Crime, Thriller	4.0	11	Biju Bhaskar Nair	Augustine	Fathima Babu	Byon

In [19]: # Predict movie ratings based on features, and remove null values from features df.dropna(subset=['Name', 'Year', 'Duration', 'Rating', 'Votes'], inplace=True)

In [20]: ► df.isna().sum()

Out[20]: Name 0 Year 0 Duration 0 Genre 31 0 Rating Votes 0 Director 1 Actor 1 75 Actor 2 117 Actor 3 163 dtype: int64

```
    df.head()

In [21]:
    Out[21]:
                          Name
                                  Year Duration
                                                       Genre Rating Votes
                                                                             Director
                                                                                       Actor 1
                                                                                                     Actor 2
                                                                                                               Actor 3
                     #Gadhvi (He
                                                                              Gaurav
                                                                                        Rasika
                                                                                                      Vivek
                                                                                                                Arvind
                                         109 min
                                                                         8
                   thought he was
                                 (2019)
                                                       Drama
                                                                 7.0
                                                                              Bakshi
                                                                                         Dugal
                                                                                                  Ghamande
                                                                                                                Jangid
                         Gandhi)
                                                     Comedy,
                                                                                                              Siddhant
                                                                               Ovais
                3
                        #Yaaram
                                 (2019)
                                         110 min
                                                                 4.4
                                                                        35
                                                                                        Prateik
                                                                                                   Ishita Raj
                                                    Romance
                                                                               Khan
                                                                                                               Kapoor
                                                     Comedy,
                   ...Aur Pyaar Ho
                                                                               Rahul
                                                                                        Bobby
                                                                                                  Aishwarya
                                                                                                              Shammi
                                 (1997)
                                                                 4.7
                                                                       827
                                         147 min
                                                      Drama,
                                                                                               Rai Bachchan
                                                                              Rawail
                                                                                         Deol
                                                                                                               Kapoor
                           Gaya
                                                      Musical
                                                      Drama,
                                                                                                    Minissha
                                                                              Shoojit
                                                                                        Jimmy
                                                                                                               Yashpal
                                 (2005)
                                                                     1,086
                6
                        ...Yahaan
                                         142 min
                                                    Romance,
                                                                 7.4
                                                                               Sircar
                                                                                       Sheirgill
                                                                                                     Lamba
                                                                                                               Sharma
                                                         War
                                                       Horror,
                    ?: A Question
                                                                              Allyson
                                                                                         Yash
                                                                                                    Muntazir
                                                                                                                 Kiran
                8
                                 (2012)
                                                                 5.6
                                                                       326
                                          82 min
                                                     Mystery,
                           Mark
                                                                                                                Bhatia
                                                                                Patel
                                                                                         Dave
                                                                                                     Ahmad
                                                       Thriller
          #Dataset Overview after clearning null values
In [22]:
              df.shape[0]
                                 #Number of rows
    Out[22]: 5851
In [23]:
           M
              df.shape[1]
                                 #Number of columns
    Out[23]: 10
In [24]:

    df.isna().sum().values.sum() #Total number of missing values

    Out[24]: 387
           ▶ df.nunique() #total number of unique values
In [25]:
    Out[25]: Name
                             5570
               Year
                               91
               Duration
                              178
               Genre
                              393
               Rating
                               83
               Votes
                             2030
               Director
                             2549
               Actor 1
                            2046
               Actor 2
                             2373
               Actor 3
                             2572
               dtype: int64
              # Remove ("-2019") parentheses from YEAR column and we will convert to INT
In [26]:
               df['Year'] = df['Year'].str.strip('()').astype(int)
In [27]:
              # Remove ("1,086") commas from Votes column and we will convert to INT
               df['Votes'] = df['Votes'].str.replace(',','').astype(int)
```

```
# Remove (109 min) min from Duration and we will convert to INT
In [28]:
               df['Duration'] = df['Duration'].str.replace('min','').astype(int)
In [29]:

    df.info()
               <class 'pandas.core.frame.DataFrame'>
               Int64Index: 5851 entries, 1 to 15508
               Data columns (total 10 columns):
                #
                     Column
                                Non-Null Count Dtype
                0
                     Name
                                5851 non-null
                                                   object
                1
                     Year
                                5851 non-null
                                                   int32
                2
                     Duration 5851 non-null
                                                   int32
                3
                     Genre
                                5820 non-null
                                                   object
                4
                     Rating
                                5851 non-null
                                                   float64
                5
                                5851 non-null
                     Votes
                                                   int32
                6
                    Director
                               5850 non-null
                                                   object
                7
                     Actor 1
                                5776 non-null
                                                   object
                8
                     Actor 2
                                5734 non-null
                                                   object
                     Actor 3
                                5688 non-null
                                                   object
               dtypes: float64(1), int32(3), object(6)
               memory usage: 434.3+ KB
In [30]:
              df.describe()
    Out[30]:
                             Year
                                      Duration
                                                    Rating
                                                                    Votes
                count 5851.000000
                                                              5851.000000
                                   5851.000000 5851.000000
                mean
                      1996.416852
                                    132.294480
                                                  5.931875
                                                              2611.273116
                  std
                         19.914640
                                     26.555826
                                                   1.389942
                                                             13433.828528
                      1931.000000
                                     21.000000
                                                  1.100000
                                                                 5.000000
                  min
                 25%
                       1983.000000
                                    117.000000
                                                  5.000000
                                                                28.000000
                 50%
                      2002.000000
                                    134.000000
                                                  6.100000
                                                               119.000000
                 75%
                      2013.000000
                                    150.000000
                                                  7.000000
                                                               862.500000
                 max 2021.000000
                                    321.000000
                                                 10.000000 591417.000000
In [32]:
                # Drop the Genre column
               df.drop('Genre', axis=1, inplace=True)
              df.head()
In [33]:
    Out[33]:
                                 Name
                                       Year
                                            Duration Rating
                                                             Votes
                                                                       Director
                                                                                   Actor 1
                                                                                                   Actor 2
                                                                                                                Actor 3
                     #Gadhvi (He thought
                                                                                                                 Arvind
                                                                        Gaurav
                                                                                    Rasika
                1
                                       2019
                                                  109
                                                          7.0
                                                                  8
                                                                                            Vivek Ghamande
                         he was Gandhi)
                                                                        Bakshi
                                                                                     Dugal
                                                                                                                 Jangid
                                                                                                               Siddhant
                3
                              #Yaaram 2019
                                                  110
                                                          4.4
                                                                 35
                                                                    Ovais Khan
                                                                                    Prateik
                                                                                                  Ishita Raj
                                                                                                                Kapoor
                                                                                                               Shammi
                                                                         Rahul
                                                                                              Aishwarya Rai
                5
                     ...Aur Pyaar Ho Gaya
                                       1997
                                                  147
                                                          4.7
                                                                827
                                                                                Bobby Deol
                                                                         Rawail
                                                                                                  Bachchan
                                                                                                                Kapoor
                                                                        Shoojit
                                                                                    Jimmy
                                                                                                                Yashpal
                6
                              ...Yahaan 2005
                                                  142
                                                          7.4
                                                               1086
                                                                                             Minissha Lamba
                                                                         Sircar
                                                                                   Sheirgill
                                                                                                                Sharma
                                                                        Allyson
                8
                      ?: A Question Mark 2012
                                                   82
                                                          5.6
                                                                326
                                                                                 Yash Dave
                                                                                             Muntazir Ahmad
                                                                                                            Kiran Bhatia
                                                                          Patel
```

```
In [34]: 

import warnings
warnings.filterwarnings('ignore')
```

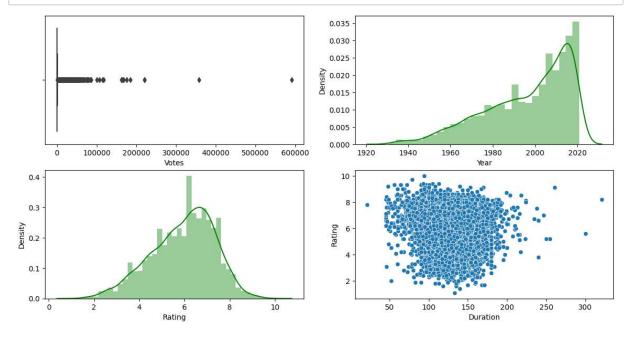
Exploratory Data Analysis (EDA)

```
In [38]: | plt.figure(figsize=(14, 7))
    plt.subplot(2, 2, 1)
    sns.boxplot(x='Votes', data=df)

plt.subplot(2, 2, 2)
    sns.distplot(df['Year'], color='g')

plt.subplot(2, 2, 3)
    sns.distplot(df['Rating'], color='g')
    plt.subplot(2, 2, 4)

sns.scatterplot(x=df['Duration'], y=df['Rating'], data=df)
    plt.show()
```



```
In [39]:
           #Histogram
              df.hist(figsize=(30, 15))
   Out[39]: array([[<Axes: title={'center': 'Year'}>,
                      <Axes: title={'center': 'Duration'}>],
                     [<Axes: title={'center': 'Rating'}>,
                      <Axes: title={'center': 'Votes'}>]], dtype=object)
In [40]:
          # Heatmap for Correlation Matrix
              corrmat = df.corr()
              fig = plt.figure(figsize= (20, 5))
              sns.heatmap(corrmat, vmax = .8, square = True, annot = True)
              plt.show()
                                                                                     - 0.8
               Year
                                    -0.34
                                                 -0.18
                                                               0.12
                        1
                                                                                     - 0.6
               Duration
                                                                                     - 0.4
                      -0.34
                                                 -0.031
                                                               0.1
                                      1
                                                                                     - 0.2
               Rating
                      -0.18
                                   -0.031
                                                               0.13
                                                   1
                                                                                     - 0.0
                                     0.1
                       0.12
                                                  0.13
                                                                1
                                                                                      -0.2
                       Year
                                  Duration
                                                Rating
                                                              Votes
```

```
In [41]: M df.head()
```

Out[41]:

Actor 3	Actor 2	Actor 1	Director	Votes	Rating	Duration	Year	Name	
Arvind Jangid	Vivek Ghamande	Rasika Dugal	Gaurav Bakshi	8	7.0	109	2019	#Gadhvi (He thought he was Gandhi)	1
Siddhant Kapoor	I shita Raj	Prateik	Ovais Khan	35	4.4	110	2019	#Yaaram	3
Shammi Kapoor	Aishwarya Rai Bachchan	Bobby Deol	Rahul Rawail	827	4.7	147	1997	Aur Pyaar Ho Gaya	5
Yashpal Sharma	Minissha Lamba	Jimmy Sheirgill	Shoojit Sircar	1086	7.4	142	2005	Yahaan	6
Kiran Bhatia	Muntazir Ahmad	Yash Dave	Allyson Patel	326	5.6	82	2012	?: A Question Mark	8

```
In [42]:  # Now we will drop another columns
df.drop(['Name', 'Director', 'Actor 1', 'Actor 2', 'Actor 3'], axis = 1, inplace=True)
df.head()
```

Out[42]:

	Year	Duration	Rating	Votes
1	2019	109	7.0	8
3	2019	110	4.4	35
5	1997	147	4.7	827
6	2005	142	7.4	1086
8	2012	82	5.6	326

In [44]: ► X.head()

Out[44]:

	Year	Duration	Votes
1	2019	109	8
3	2019	110	35
5	1997	147	827
6	2005	142	1086
8	2012	82	326

In [45]: ▶ y.head()

Out[45]: 1

- 1 7.0
- 3 4.4
- 54.767.4
- 0 /.2
- 8 5.6

Name: Rating, dtype: float64

```
Movie Rating Prediction with Python - Jupyter Notebook
          # Now we will split data into Training and Testing sets
In [46]:
             from sklearn.model selection import train test split
             X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state=1000
         Building a Model
In [47]:
          # Create a pipeline with SGDRegressor and standard scalling
             from sklearn.linear_model import SGDRegressor
             from sklearn.preprocessing import StandardScaler
             from sklearn.pipeline import Pipeline
In [50]:
             pipeline = Pipeline([('Scaler', StandardScaler()), ('sgd', SGDRegressor(max_iter=1000))])
In [51]:

▶ pipeline.fit(X train, y train)
   Out[51]:
                    Pipeline
                StandardScaler
                SGDRegressor
          ▶ # Now Predict ratings on the test set
In [52]:
             y_pred_pipeline = pipeline.predict(X_test)
In [54]:
             y pred pipeline
```

```
Out[54]: array([5.81657251, 6.55745344, 5.71017806, ..., 5.6660869 , 5.79502961,
                5.85576758])
```

Model Evaluation

```
In [55]:
          ▶ from sklearn.metrics import mean absolute error, mean squared error, r2 score
             # Evaluation Metrics for the Pipeline
             mae_pipeline = mean_absolute_error(y_test, y_pred_pipeline)
             mse_pipeline = mean_squared_error(y_test, y_pred_pipeline)
             r2_pipeline = r2_score(y_test, y_pred_pipeline)
```

```
▶ print("Pipeline Mean Absolute Error:", mae_pipeline)
In [56]:
             print("Pipeline Mean Squared Error:", mse pipeline)
             print("Pipeline R-square:", r2 pipeline)
```

Pipeline Mean Absolute Error: 1.0424472965567542 Pipeline Mean Squared Error: 1.7538952120408835 Pipeline R-square: 0.03902454076923578

Model Deployment