```
In [1]: import pandas as pd
          import numpy as np
          from nltk.tokenize import sent_tokenize, word_tokenize
          from sklearn.feature_extraction.text import CountVectorizer
          from sklearn.model_selection import train_test_split
          from sklearn.svm import SVC
          from sklearn.datasets import fetch_20newsgroups
          from nltk.corpus import stopwords
          import string
          from nltk import pos_tag
          from nltk.stem import WordNetLemmatizer
          from sklearn.feature extraction.text import TfidfVectorizer
          from sklearn.naive_bayes import MultinomialNB
          from sklearn.ensemble import RandomForestClassifier
          from sklearn.svm import SVC
          import pandas as pd
          from sklearn.model_selection import train_test_split
          from sklearn import preprocessing
          import seaborn as sns
          import matplotlib.pyplot as plt
          %matplotlib inline
In [2]:
          import nltk
          nltk.download('stopwords')
          [nltk_data] Downloading package stopwords to C:\Users\NIHITHA
                              KANCHI\AppData\Roaming\nltk_data...
          [nltk data]
          [nltk data]
                           Unzipping corpora\stopwords.zip.
          True
          data = pd.read_csv('twitter_training.csv')
          v data = pd.read csv('twitter validation.csv')
          data
In [4]:
Out[4]:
                 2401
                       Borderlands
                                    Positive im getting on borderlands and i will murder you all,
              0 2401
                                     Positive
                                                      I am coming to the borders and I will kill you...
                        Borderlands
              1 2401
                        Borderlands
                                     Positive
                                                       im getting on borderlands and i will kill you ...
              2
                 2401
                        Borderlands
                                     Positive
                                                   im coming on borderlands and i will murder you...
              3 2401
                        Borderlands
                                     Positive
                                                     im getting on borderlands 2 and i will murder ...
              4 2401
                        Borderlands
                                     Positive
                                                    im getting into borderlands and i can murder y...
              ...
          74676 9200
                             Nvidia
                                     Positive
                                                     Just realized that the Windows partition of my...
          74677 9200
                             Nvidia
                                     Positive
                                                     Just realized that my Mac window partition is ...
          74678
                 9200
                             Nvidia
                                     Positive
                                                    Just realized the windows partition of my Mac ...
          74679 9200
                             Nvidia
                                     Positive
                                                    Just realized between the windows partition of...
          74680 9200
                             Nvidia
                                     Positive
                                                      Just like the windows partition of my Mac is I...
         74681 rows × 4 columns
In [5]:
          v_data
                                                     I mentioned on Facebook that I was struggling for motivation to go for a run the other day, which has
               3364
                               Facebook Irrelevant
                                                      been translated by Tom's great auntie as 'Hayley can't get out of bed' and told to his grandma, who
                                                                                                              now thinks I'm a lazy, terrible person
            0
                352
                                 Amazon
                                            Neutral
                                                                                                     BBC News - Amazon boss Jeff Bezos rejects clai...
            1 8312
                                                                                                     @Microsoft Why do I pay for WORD when it funct...
                                Microsoft
                                           Negative
            2 4371
                                  CS-GO
                                           Negative
                                                                                                      CSGO matchmaking is so full of closet hacking,...
            3 4433
                                  Google
                                            Neutral
                                                                                                       Now the President is slapping Americans in the...
            4 6273
                                    FIFA
                                                                                                   Hi @EAHelp I've had Madeleine McCann in my cel...
                                           Negative
          994 4891
                     GrandTheftAuto(GTA)
                                          Irrelevant
                                                                                                           ★ Toronto is the arts and culture capital of ...
                                                                                            tHIS IS ACTUALLY A GOOD MOVE TOT BRING MORE VI...
          995 4359
                                  CS-GO
                                          Irrelevant
          996 2652
                              Borderlands
                                            Positive
                                                                                                        Today sucked so it's time to drink wine n play...
          997 8069
                                Microsoft
                                            Positive
                                                                                                       Bought a fraction of Microsoft today. Small wins.
          998 6960
                         johnson&johnson
                                                                                                       Johnson & Johnson to stop selling talc baby po...
                                            Neutral
```

999 rows × 4 columns

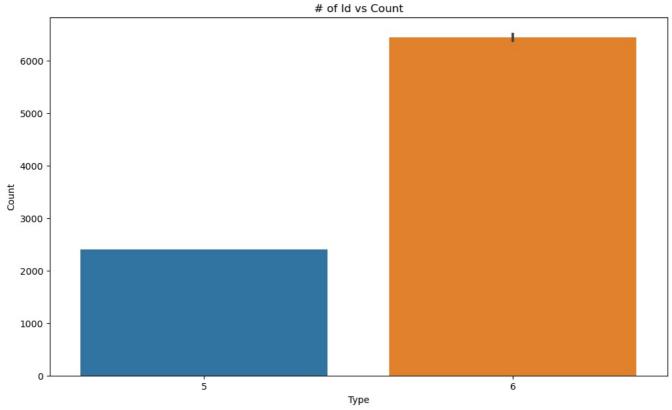
```
v_data.columns = ['id', 'game', 'sentiment', 'text']
 In [7]:
            data
                       id
                                game sentiment
 Out[7]:
                 0 2401
                          Borderlands
                                          Positive
                                                      I am coming to the borders and I will kill you...
                 1 2401
                          Borderlands
                                          Positive
                                                       im getting on borderlands and i will kill you ...
                 2 2401
                          Borderlands
                                          Positive
                                                   im coming on borderlands and i will murder you...
                 3 2401
                          Borderlands
                                          Positive
                                                     im getting on borderlands 2 and i will murder ...
                 4 2401
                          Borderlands
                                          Positive
                                                    im getting into borderlands and i can murder y...
            74676 9200
                                Nvidia
                                          Positive
                                                     Just realized that the Windows partition of my...
                                Nvidia
            74677
                   9200
                                          Positive
                                                     Just realized that my Mac window partition is ...
            74678 9200
                                Nvidia
                                          Positive
                                                    Just realized the windows partition of my Mac ...
            74679
                   9200
                                Nvidia
                                          Positive
                                                    Just realized between the windows partition of...
            74680 9200
                                Nvidia
                                          Positive
                                                     Just like the windows partition of my Mac is I...
           74681 rows × 4 columns
 In [8]:
            v data
                    id
                                       game sentiment
                                                                                                             text
 Out[8]:
                   352
                                     Amazon
                                                 Neutral
                                                                   BBC News - Amazon boss Jeff Bezos rejects clai...
              1 8312
                                                Negative
                                                                   @Microsoft Why do I pay for WORD when it funct...
                                    Microsoft
              2 4371
                                     CS-GO
                                                Negative
                                                                    CSGO matchmaking is so full of closet hacking,...
              3 4433
                                      Google
                                                 Neutral
                                                                     Now the President is slapping Americans in the...
              4 6273
                                       FIFA
                                                Negative
                                                                 Hi @EAHelp I've had Madeleine McCann in my cel...
            994 4891
                        GrandTheftAuto(GTA)
                                               Irrelevant
                                                                         * Toronto is the arts and culture capital of ...
            995
                 4359
                                     CS-GO
                                               Irrelevant this is actually a good move tot bring more vi...
            996
                 2652
                                 Borderlands
                                                Positive
                                                                      Today sucked so it's time to drink wine n play...
            997
                 8069
                                    Microsoft
                                                 Positive
                                                                     Bought a fraction of Microsoft today. Small wins.
            998 6960
                            iohnson&iohnson
                                                 Neutral
                                                                     Johnson & Johnson to stop selling talc baby po...
           999 rows × 4 columns
            data.shape
 In [9]:
            (74681, 4)
 Out[9]:
            data.columns
In [10]:
            Index(['id', 'game', 'sentiment', 'text'], dtype='object')
Out[10]:
In [11]:
            data.describe(include='all')
                                id
                                                     game
                                                            sentiment
                                                                         text
                     74681.000000
                                                    74681
                                                                74681
                                                                       73995
             count
            unique
                              NaN
                                                       32
                                                                    4 69490
                top
                              NaN
                                   TomClancysRainbowSix
                                                             Negative
                              NaN
                                                     2400
                                                                22542
                                                                         172
               freq
                      6432.640149
                                                     NaN
                                                                 NaN
                                                                         NaN
              mean
                std
                      3740.423819
                                                      NaN
                                                                 NaN
                                                                         NaN
                         1.000000
                                                                 NaN
               min
                                                      NaN
                                                                         NaN
               25%
                      3195.000000
                                                      NaN
                                                                 NaN
                                                                         NaN
               50%
                      6422.000000
                                                      NaN
                                                                 NaN
                                                                         NaN
               75%
                      9601.000000
                                                      NaN
                                                                 NaN
                                                                         NaN
                     13200.000000
                                                      NaN
                                                                 NaN
                                                                         NaN
               max
In [12]: id types = data['id'].value counts()
            id types
```

.text.

data.columns = ['ld', 'game', 'sentiment',

In Ibl:

```
5203
6164
Out[12]:
                         6
              6141
                         6
              6142
                         6
              6143
                         6
              4678
                         6
              4679
                         6
              4680
                         6
              4681
                         6
              2401
                         5
              Name: id, Length: 12447, dtype: int64
             plt.figure(figsize=(12,7))
sns.barplot(y=id_types.index, x=id_types.values)
plt.xlabel('Type')
plt.ylabel('Count')
plt.ylabel('Count')
In [13]:
              plt.title('# of Id vs Count')
              plt.show()
```

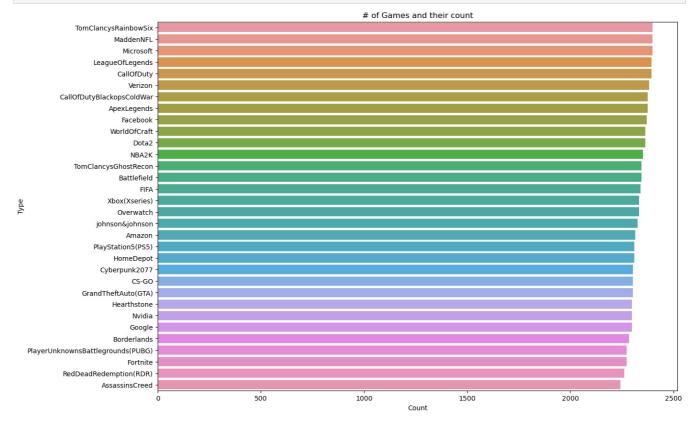


```
In [14]: game_types = data['game'].value_counts()
          {\sf game\_types}
```

```
Out[14]: TomClancysRainbowSix
MaddenNFL
                                                  2400
                                                  2400
          Microsoft
                                                  2400
          LeagueOfLegends
                                                  2394
          CallOfDuty
                                                  2394
                                                  2382
          Verizon
          CallOfDutyBlackopsColdWar
                                                  2376
          ApexLegends
                                                  2376
          Facebook
                                                  2370
          WorldOfCraft
                                                  2364
          Dota2
                                                  2364
          NBA2K
                                                  2352
          {\tt TomClancysGhostRecon}
                                                  2346
          Battlefield
                                                  2346
                                                  2340
          FIFA
          Xbox(Xseries)
                                                  2334
          Overwatch
                                                  2334
          johnson&johnson
                                                  2328
          Amazon
                                                  2316
          PlayStation5(PS5)
                                                  2310
          HomeDepot
                                                  2310
          Cyberpunk2077
                                                  2304
          CS-G0
                                                  2304
          GrandTheftAuto(GTA)
                                                  2304
          Hearthstone
                                                  2298
          Nvidia
                                                  2298
                                                  2298
          Google
          Borderlands
                                                  2285
          PlayerUnknownsBattlegrounds(PUBG)
                                                  2274
                                                  2274
          Fortnite
          RedDeadRedemption(RDR)
                                                  2262
          AssassinsCreed
                                                  2244
          Name: game, dtype: int64
```

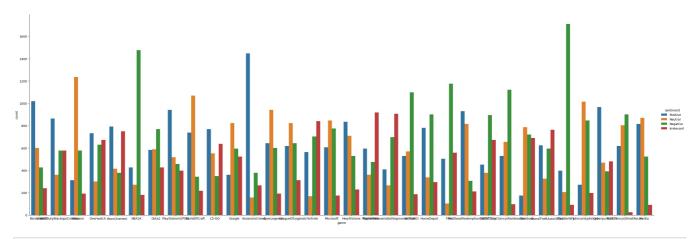
```
In [15]: plt.figure(figsize=(14,10))

sns.barplot(x=game_types.values,y=game_types.index)
plt.title('# of Games and their count')
plt.ylabel('Type')
plt.xlabel('Count')
plt.show()
```



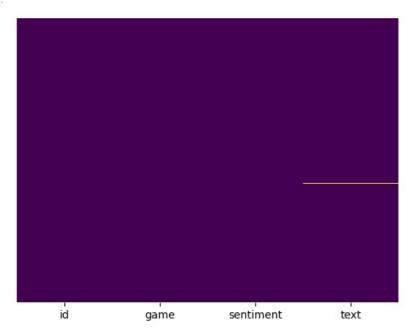
```
In [16]: sns.catplot(x="game",hue="sentiment", kind="count",height=10,aspect=3, data=data)
```

Out[16]: <seaborn.axisgrid.FacetGrid at 0x20f43513150>



```
In [17]: sns.heatmap(data.isnull(),yticklabels=False,cbar=False,cmap='viridis')
```

Out[17]: <Axes: >



```
In [18]: total_null=data.isnull().sum().sort_values(ascending=False)
    percent = ((data.isnull().sum()/data.isnull().count())*100).sort_values(ascending = False)
    print("Total records = ", data.shape[0])
    missing_data = pd.concat([total_null,percent.round(2)],axis=1,keys=['Total Missing','In Percent'])
    missing_data.head(10)
```

Total records = 74681

Out[18]:

	Total Missing	In Percent
text	686	0.92
id	0	0.00
game	0	0.00
sentiment	0	0.00

```
In [19]: data.dropna(subset=['text'],inplace=True)

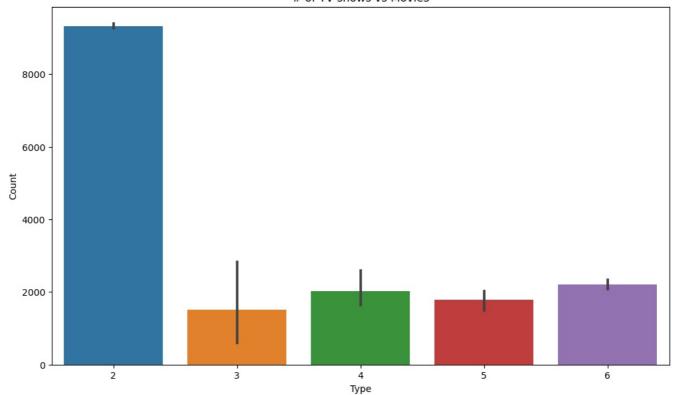
total_null=data.isnull().sum().sort_values(ascending=False)
percent = ((data.isnull().sum()/data.isnull().count())*100).sort_values(ascending = False)
print("Total records = ", data.shape[0])
missing_data = pd.concat([total_null,percent.round(2)],axis=1,keys=['Total Missing','In Percent'])
missing_data.head(10)
```

Total records = 73995

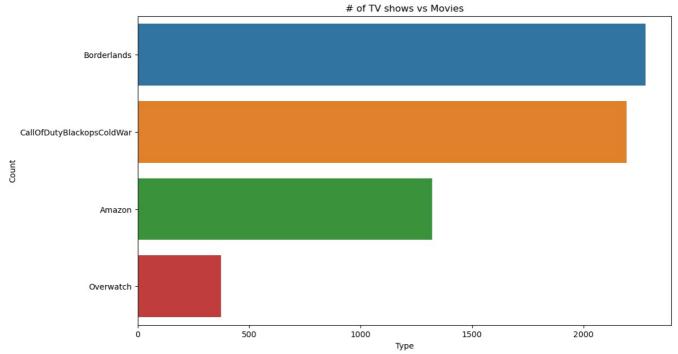
```
id
                                0
                                         0.0
               game
                                         0.0
           sentiment
                                0
                                         0.0
                                0
                                         0.0
                text
           train0=data[data['sentiment']=="Negative"]
train1=data[data['sentiment']=="Positive"]
In [20]:
           train2=data[data['sentiment']=="Irrelevant"]
           train3=data[data['sentiment']=="Neutral"]
In [21]: train0.shape, train1.shape, train2.shape, train3.shape
           ((22358, 4), (20654, 4), (12875, 4), (18108, 4))
           train0=train0[:int(train0.shape[0]/12)]
In [22]:
           train1=train1[:int(train1.shape[0]/12)]
           train2=train2[:int(train2.shape[0]/12)]
           train3=train3[:int(train3.shape[0]/12)]
In [23]: train0.shape, train1.shape, train2.shape, train3.shape
           ((1863, 4), (1721, 4), (1072, 4), (1509, 4))
Out[23]:
In [24]:
           data=pd.concat([train0,train1,train2,train3],axis=0)
           data
Out[24]:
                   id
                           game sentiment
                                                                                  text
                                              the biggest dissappoinment in my life came out...
             23 2405 Borderlands
                                   Negative
             24 2405 Borderlands
                                   Negative
                                              The biggest disappointment of my life came a y...
             25 2405 Borderlands
                                   Negative
                                              The biggest disappointment of my life came a y...
             26 2405 Borderlands
                                              the biggest dissappoinment in my life coming o...
                                    Negative
             27 2405 Borderlands
                                   Negative
                                               For the biggest male dissappoinment in my life...
             ...
           5603
                 165
                                     Neutral An amazing read aloud book for you and your ch...
                         Amazon
           5604
                  165
                         Amazon
                                     Neutral
                                              An amazing reading book for you and your child...
           5605
                  165
                         Amazon
                                     Neutral
                                             An amazing book to read aloud for you and your...
           5606
                  165
                                     Neutral
                                             An amazing read aloud book for you and your ch...
                          Amazon
           5607
                  165
                          Amazon
                                     Neutral
                                            and An amazing read aloud book for you and you...
          6165 rows × 4 columns
In [25]:
           id types = data['id'].value counts()
           id types
           2405
Out[25]:
           1810
                    6
           1748
                    6
           1754
           1760
                    6
           1602
                    3
           1880
                    3
           333
                    3
           9388
           9267
                    2
           Name: id, Length: 1040, dtype: int64
In [26]:
           plt.figure(figsize=(12,7))
           sns.barplot(x=id_types.values,y=id_types.index)
           plt.xlabel('Type')
           plt.ylabel('Count')
           plt.title('# of TV shows vs Movies')
           plt.show()
```

Total Missing In Percent

Out[19]:



```
In [27]: game_types = data['game'].value_counts()
          {\tt game\_types}
          Borderlands
                                        2279
Out[27]:
          CallOfDutyBlackopsColdWar
                                        2192
          Amazon
                                        1321
          Overwatch
                                         373
         Name: game, dtype: int64
In [28]:
          plt.figure(figsize=(12,7))
          sns.barplot(x=game_types.values,y=game_types.index)
          plt.xlabel('Type')
          plt.ylabel('Count')
          plt.title('# of TV shows vs Movies')
          plt.show()
```



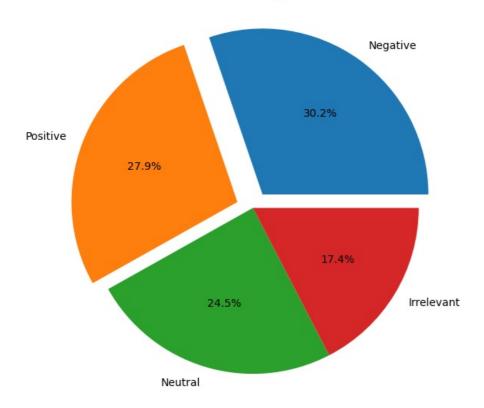
```
sentiment_types = data['sentiment'].value_counts()
In [29]:
         sentiment_types
         Negative
                        1863
Out[29]:
         Positive
                        1721
         Neutral
                        1509
```

1072 Name: sentiment, dtype: int64

Irrelevant

```
In [30]: plt.figure(figsize=(12,7))
  plt.pie(x=sentiment_types.values, labels=sentiment_types.index, autopct='%.1f%', explode=[0.1, 0.1,0,0])
  plt.title('The Difference in the Type of Contents')
  plt.show()
```

The Difference in the Type of Contents



```
sns.catplot(x='game',hue='sentiment',kind='count',height=7,aspect=2,data=data)
          <seaborn.axisgrid.FacetGrid at 0x20f42d80810>
Out[31]:
            1000
             800
                                                                                                                              sentiment
                                                                                                                              Negative
                                                                                                                              Positive
                                                                                                                            Irrelevant
                                                                                                                              Neutral
             400
             200
                          Borderlands
                                                CallOfDutyBlackopsColdWar
                                                                                Amazon
                                                                                                          Overwatch
In [32]: from sklearn import preprocessing
          label_encoder = preprocessing.LabelEncoder()
          data['sentiment']=label_encoder.fit_transform(data['sentiment'])
In [33]:
          data['game']=label_encoder.fit_transform(data['game'])
```

v_data['sentiment']=label_encoder.fit_transform(v_data['sentiment'])

v_data['game']=label_encoder.fit_transform(v_data['game'])

In [34]: data = data.drop(['id'],axis=1)

data

Out[34]:		game	sentiment	text
:	23	1	1	the biggest dissappoinment in my life came out
	24	1	1	The biggest disappointment of my life came a y
	25	1	1	The biggest disappointment of my life came a y
	26	1	1	the biggest dissappoinment in my life coming o
	27	1	1	For the biggest male dissappoinment in my life
560	5603	0	2	An amazing read aloud book for you and your ch
	5604	0	2	An amazing reading book for you and your child
	5605	0	2	An amazing book to read aloud for you and your
	5606	0	2	An amazing read aloud book for you and your ch
	5607	0	2	and An amazing read aloud book for you and you

6165 rows × 3 columns