```
In [ ]: import pandas as pd
   import numpy as np
   from scipy.sparse import csr_matrix
   from sklearn.neighbors import NearestNeighbors
   import matplotlib.pyplot as plt
   import seaborn as sns
```

```
In [ ]: from google.colab import files
    uploaded = files.upload()
```

Choose Files No file chosen

Upload widget is only available when the cell has been executed in the current browser session. Please rerun this cell to enable.

Saving movies.csv to movies.csv

```
In [ ]: from google.colab import files
uploaded = files.upload()
```

Choose Files No file chosen

Upload widget is only available when the cell has been executed in the current browser session. Please rerun this cell to enable.

Saving ratings.xlsx to ratings.xlsx

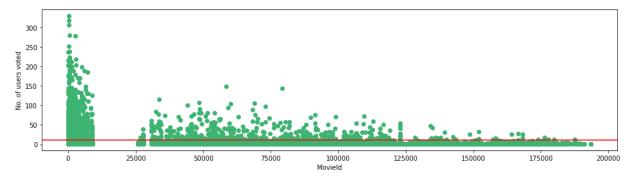
```
In [ ]: movies = pd.read_csv("movies.csv")
    ratings = pd.read_excel("ratings.xlsx")
```

```
In [ ]: movies.head()
```

Out[8]:	movield		title	genres
	0	1	Toy Story (1995)	Adventure Animation Children Comedy Fantasy
	1	2	Jumanji (1995)	Adventure Children Fantasy
	2	3	Grumpier Old Men (1995)	Comedy Romance
	3	4	Waiting to Exhale (1995)	Comedy Drama Romance
	4	5	Father of the Bride Part II (1995)	Comedy

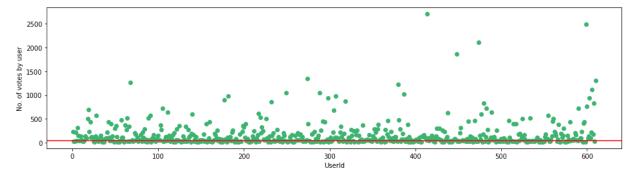
```
In [ ]: ratings.head()
 Out[9]:
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                                       964983815
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                            50
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                                      964982931
 In [ ]: final dataset = ratings.pivot(index='movieId',columns='userId',values='rating')
           final dataset.head()
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 In [ ]: final dataset.fillna(0,inplace=True)
           final_dataset.head()
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           5 rows × 610 columns
 In [ ]: |no_user_voted = ratings.groupby('movieId')['rating'].agg('count')
           no movies voted = ratings.groupby('userId')['rating'].agg('count')
```

```
In [ ]: f,ax = plt.subplots(1,1,figsize=(16,4))
# ratings['rating'].plot(kind='hist')
plt.scatter(no_user_voted.index,no_user_voted,color='mediumseagreen')
plt.axhline(y=10,color='r')
plt.xlabel('MovieId')
plt.ylabel('No. of users voted')
plt.show()
```



```
In [ ]: final_dataset = final_dataset.loc[no_user_voted[no_user_voted > 10].index,:]
```

```
In [ ]: f,ax = plt.subplots(1,1,figsize=(16,4))
    plt.scatter(no_movies_voted.index,no_movies_voted,color='mediumseagreen')
    plt.axhline(y=50,color='r')
    plt.xlabel('UserId')
    plt.ylabel('No. of votes by user')
    plt.show()
```



```
In [ ]: final dataset=final dataset.loc[:,no movies voted[no movies voted > 50].index]
          final dataset
Out[18]:
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          2121 rows × 378 columns
 In []: |sample = np.array([[0,0,3,0,0],[4,0,0,0,2],[0,0,0,0,1]])
          sparsity = 1.0 - ( np.count_nonzero(sample) / float(sample.size) )
          print(sparsity)
          0.7333333333333334
 In [ ]: csr sample = csr matrix(sample)
          print(csr_sample)
             (0, 2)
                            3
             (1, 0)
                            4
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             (1, 4)
             (2, 4)
                            1
 In [ ]: csr data = csr matrix(final dataset.values)
```

In []: knn = NearestNeighbors(metric='cosine', algorithm='brute', n_neighbors=20, n_jobs
knn.fit(csr_data)

final dataset.reset index(inplace=True)

Out[22]: NearestNeighbors(algorithm='brute', metric='cosine', n_jobs=-1, n_neighbors=20)

```
In [ ]: def get_movie_recommendation(movie_name):
            n_movies_to_reccomend = 10
            movie_list = movies[movies['title'].str.contains(movie_name)]
            if len(movie list):
                movie_idx= movie_list.iloc[0]['movieId']
                movie_idx = final_dataset[final_dataset['movieId'] == movie_idx].index[0]
                distances , indices = knn.kneighbors(csr_data[movie_idx],n_neighbors=n_movie_idx]
                rec_movie_indices = sorted(list(zip(indices.squeeze().tolist(),distances.
                recommend_frame = []
                for val in rec_movie_indices:
                    movie_idx = final_dataset.iloc[val[0]]['movieId']
                    idx = movies[movies['movieId'] == movie_idx].index
                    recommend_frame.append({'Title':movies.iloc[idx]['title'].values[0],
                df = pd.DataFrame(recommend frame,index=range(1,n movies to reccomend+1))
                return df
            else:
                return "No movies found. Please check your input"
```

In []: get_movie_recommendation('Iron Man')

Out[24]:

	Title	Distance
1	Up (2009)	0.368857
2	Guardians of the Galaxy (2014)	0.368758
3	Watchmen (2009)	0.368558
4	Star Trek (2009)	0.366029
5	Batman Begins (2005)	0.362759
6	Avatar (2009)	0.310893
7	Iron Man 2 (2010)	0.307492
8	WALL·E (2008)	0.298138
9	Dark Knight, The (2008)	0.285835
10	Avengers, The (2012)	0.285319

In []: get_movie_recommendation('Memento')

Out[25]:

	Title	Distance
1	American Beauty (1999)	0.389346
2	American History X (1998)	0.388615
3	Pulp Fiction (1994)	0.386235
4	Lord of the Rings: The Return of the King, The	0.371622
5	Kill Bill: Vol. 1 (2003)	0.350167
6	Lord of the Rings: The Two Towers, The (2002)	0.348358
7	Eternal Sunshine of the Spotless Mind (2004)	0.346196
8	Matrix, The (1999)	0.326215
9	Lord of the Rings: The Fellowship of the Ring,	0.316777
10	Fight Club (1999)	0.272380