Out[5]:	_	budget	genres	homepage	id	keywords	original_language	original_title	ovei
	0	237000000	[{"id": 28, "name": "Action"}, {"id": 12, "nam	http://www.avatarmovie.com/	19995	[{"id": 1463, "name": "culture clash"}, {"id":	en	Avatar	cent parar Mar
	1	300000000	[{"id": 12, "name": "Adventure"}, {"id": 14, "	http://disney.go.com/disneypictures/pirates/	285	[{"id": 270, "name": "ocean"}, {"id": 726, "na	en	Pirates of the Caribbean: At World's End	Ca Bark bel dead
	2	245000000	[{"id": 28, "name": "Action"}, {"id": 12, "nam	http://www.sonypictures.com/movies/spectre/	206647	[{"id": 470, "name": "spy"}, {"id": 818, "name	en	Spectre	A come:
	3	250000000	[{"id": 28, "name": "Action"}, {"id": 80, "nam	http://www.thedarkknightrises.com/	49026	[{"id": 849, "name": "dc comics"}, {"id": 853,	en	The Dark Knight Rises	Follo the o of D Atto Ha
	4	260000000	[{"id": 28, "name": "Action"}, {"id": 12, "nam	http://movies.disney.com/john-carter	49529	[{"id": 818, "name": "based on novel"}, {"id":	en	John Carter	Carte v fc m
	4								•

[7]:	cre	dits.head	d()					
t[7]:		movie_id		title	cast	crew		
	0	19995		Avatar	[{"cast_id": 242, "character": "Jake Sully", "	[{"credit_id": "52fe48009251416c750aca23", "de		
	1	285		Pirates of the Caribbean: At World's End	[{"cast_id": 4, "character": "Captain Jack Spa	[{"credit_id": "52fe4232c3a36847f800b579", "de		
	2	206647		Spectre	[{"cast_id": 1, "character": "James Bond", "cr	[{"credit_id": "54805967c3a36829b5002c41", "de		
	3	49026		The Dark Knight Rises	[{"cast_id": 2, "character": "Bruce Wayne / Ba	[{"credit_id": "52fe4781c3a36847f81398c3", "de		
	4	49529		John Carter	[{"cast_id": 5, "character": "John Carter", "c	[{"credit_id": "52fe479ac3a36847f813eaa3", "de		
[9]:	cre	dits.head	d(1)					
[9]:		movie_id	title		cast	crew		
-	0	19995	Avatar	[{"cast_id": 242, "character":	"Jake Sully", " [{"credit_id": "52fe480092	251416c750aca23", "de		
11]:	<pre>movies =movies.merge(credits,on="title")</pre>							
L3]:	movies.head(1)							

```
Out[13]:
                 budget
                            genres
                                                      homepage
                                                                         keywords original_language original_title overview popularity
                                                                              [{"id":
                                                                                                                            In the
                           [{"id": 28,
                                                                              1463,
                                                                                                                            22nd
                            "name":
                                                                            "name":
                                                                                                                        century, a
                          "Action"},
                                                                                                                                   150.437577
           0 237000000
                                     http://www.avatarmovie.com/ 19995
                                                                                                               Avatar
                                                                                                     en
                                                                            "culture
                                                                                                                       paraplegic
                           {"id": 12,
                                                                             clash"},
                                                                                                                        Marine is
                             "nam...
                                                                             {"id":...
                                                                                                                              di...
          1 rows × 23 columns
In [15]: movies = movies[["movie_id","title","overview","genres","keywords","cast","crew"]]
          movies.head(1)
In [17]:
                                                                             keywords
Out[17]:
                           title
                                         overview
              movie id
                                                              genres
                                                                                                      cast
                                                                                                                                       crew
                                       In the 22nd
                                                            [{"id": 28,
                                                                                           [{"cast id": 242,
                                                                            [{"id": 1463,
                                                                                                                                [{"credit id":
                                         century, a
                                                             "name":
                                                                       "name": "culture
                                                                                          "character": "Jake
           0
                 19995 Avatar
                                                                                                                "52fe48009251416c750aca23".
                                                       "Action"}, {"id":
                                  paraplegic Marine
                                                                         clash"}, {"id":...
                                                                                                 Sully", "...
                                                                                                                                       "de...
                                             is di...
                                                           12, "nam...
In [19]: movies.isnull().sum()
                         0
Out[19]:
           movie_id
           title
                         0
           overview
                         3
           genres
           keywords
                         0
           cast
                         0
           crew
           dtype: int64
In [21]:
           movies.dropna(inplace=True)
          #check for duplicated rows
In [23]:
           movies.duplicated().sum()
```

```
Out[23]: 0
In [25]: movies.iloc[0].genres
Out[25]: '[{"id": 28, "name": "Action"}, {"id": 12, "name": "Adventure"}, {"id": 14, "name": "Fantasy"}, {"id": 878, "name":
          "Science Fiction"}]'
In [27]: def convert(obj):
              L=[]
              for i in ast.literal eval(obj):
                  L.append(i['name'])
              return L
In [29]: import ast
In [31]: movies['genres'] =movies['genres'].apply(convert)
In [32]: movies.head(1)
Out[32]:
             movie id
                        title
                                      overview
                                                                       keywords
                                                                                             cast
                                                         genres
                                                                                                                            crew
                                    In the 22nd
                                                         [Action,
                                                                      [{"id": 1463,
                                                                                    [{"cast id": 242,
                                                                                                                      [{"credit id":
                                     century, a
                                                      Adventure,
          0
                                                                  "name": "culture
                                                                                  "character": "Jake
                                                                                                      "52fe48009251416c750aca23".
                19995 Avatar
                               paraplegic Marine
                                                  Fantasy, Science
                                                                    clash"}, {"id":...
                                                                                         Sully", "...
                                                                                                                            "de...
                                         is di...
                                                         Fiction1
In [35]: movies.iloc[0].keywords
Out[35]: '[{"id": 1463, "name": "culture clash"}, {"id": 2964, "name": "future"}, {"id": 3386, "name": "space war"}, {"id": 3
          388, "name": "space colony"}, {"id": 3679, "name": "society"}, {"id": 3801, "name": "space travel"}, {"id": 9685, "n
          ame": "futuristic"}, {"id": 9840, "name": "romance"}, {"id": 9882, "name": "space"}, {"id": 9951, "name": "alien"},
          {"id": 10148, "name": "tribe"}, {"id": 10158, "name": "alien planet"}, {"id": 10987, "name": "cgi"}, {"id": 11399,
          "name": "marine"}, {"id": 13065, "name": "soldier"}, {"id": 14643, "name": "battle"}, {"id": 14720, "name": "love af
          fair"}, {"id": 165431, "name": "anti war"}, {"id": 193554, "name": "power relations"}, {"id": 206690, "name": "mind
          and soul"}, {"id": 209714, "name": "3d"}]'
In [37]: def convertt(obj):
              for i in ast.literal eval(obj):
```

```
L.append(i["name"])
              return L
          movies["keywords"] =movies["keywords"].apply(convertt)
In [39]:
          def convert3(obj):
In [40]:
              L=[]
              counter =0
              for i in ast.literal_eval(obj):
                   if counter!=3:
                       L.append(i["name"])
                       counter+=1
                   else:
                       break
              return L
In [43]: movies["cast"] =movies["cast"].apply(convert3)
          movies.head(1)
In [44]:
Out[44]:
             movie id
                         title
                                      overview
                                                                        keywords
                                                         genres
                                                                                                 cast
                                                                                                                                crew
                                    In the 22nd
                                                         [Action,
                                                                    [culture clash,
                                                                                    [Sam Worthington,
                                                                                                                          [{"credit id":
                                      century, a
                                                      Adventure,
                                                                     future, space
          0
                19995 Avatar
                                                                                         Zoe Saldana,
                                                                                                          "52fe48009251416c750aca23",
                                     paraplegic
                                                 Fantasy, Science
                                                                       war, space
                                                                                    Sigourney Weaver]
                                                                                                                                "de...
                                   Marine is di...
                                                         Fiction1
                                                                          colon...
In [45]: def convertt1(obj):
              L=[]
              for i in ast.literal_eval(obj):
                  if i["job"]=="Director":
                       L.append(i["name"])
                       break
              return L
          movies["crew"]=movies["crew"].apply(convertt1)
In [46]:
In [47]: movies.head(1)
```

ut[47]:		movie_id	title	overview	genres	keywords	c	ast crew		
	0	19995	Avatar	In the 22nd century, a paraplegic Marine is di	[Action, Adventure Fantasy, Science Fiction	space war, space	[Sam Worthington, Z Saldana, Sigourr Weav	ney Cameroni		
n [48]:	<pre>movies['overview']=movies['overview'].apply(lambda x:x.split())</pre>									
n [49]:	mov	ies.head([1)							
ut[49]:		movie_id	title	overview	genres	keywords	c	ast crew		
	0	19995	Avatar	[In, the, 22nd, century,, a, paraplegic, Marin	[Action, Adventure, Fantasy, Science Fiction]	space war, space	[Sam Worthington, Z Saldana, Sigourr Weav	ney Cameronl		
n [50]:	<pre>movies["genres"]=movies["genres"].apply(lambda x:[i.replace(" ","") for i in x]) movies["keywords"]=movies["keywords"].apply(lambda x:[i.replace(" ","") for i in x]) movies["cast"]=movies["cast"].apply(lambda x:[i.replace(" ","") for i in x]) movies["crew"]=movies["crew"].apply(lambda x:[i.replace(" ","") for i in x])</pre>									
		iesį črew	u"]=movi							
n [51]:		ies crew								
n [51]: ut[51]:	mov						cast	crew		
	mov	ies.head(movie_id	(1)	es["crew"].apply(lar	nbda x:[i.replace("	","") for i in x])	cast [SamWorthington, ZoeSaldana, SigourneyWeaver]	crew [JamesCameron]		
t[51]:	0	ies.head(movie_id 19995	title Avatar	overview [In, the, 22nd, century,, a, paraplegic, Marin	genres [Action, Adventure, Fantasy, ScienceFiction]	keywords [cultureclash, future, spacewar,	[SamWorthington, ZoeSaldana, SigourneyWeaver]			

```
Out[53]:
             movie id
                          title
                                    overview
                                                                        keywords
                                                         genres
                                                                                                  cast
                                                                                                                                  tags
                                                                                                                  crew
                                 [In, the, 22nd,
                                                                                                                          [In, the, 22nd,
                                                         [Action,
                                                                     [cultureclash,
                                                                                      [SamWorthington,
                                   century,, a,
                                                     Adventure,
                                                                                                                            century,, a,
                                                                 future, spacewar,
          0
                 19995 Avatar
                                                                                           ZoeSaldana,
                                                                                                       [JamesCameron]
                                                        Fantasy,
                                    paraplegic,
                                                                                                                            paraplegic,
                                                                   spacecolony, ...
                                                                                      SigourneyWeaver]
                                                  ScienceFiction1
                                                                                                                               Marin...
                                      Marin...
In [54]: new df = movies[['movie id', 'title', 'tags']]
In [55]:
          new df.head(1)
Out[55]:
                          title
             movie id
                                                                   tags
          0
                19995 Avatar [In, the, 22nd, century,, a, paraplegic, Marin...
In [56]: new_df['tags'] = new_df['tags'].apply(lambda x:" ".join(x))
         C:\Users\parth\AppData\Local\Temp\ipykernel_15720\3089450492.py:1: SettingWithCopyWarning:
         A value is trying to be set on a copy of a slice from a DataFrame.
         Try using .loc[row indexer, col indexer] = value instead
         See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user guide/indexing.html#returning
         -a-view-versus-a-copy
           new_df['tags'] = new_df['tags'].apply(lambda x:" ".join(x))
In [57]: new_df.head(1)
Out[57]:
             movie id
                          title
                                                                    tags
          0
                 19995 Avatar In the 22nd century, a paraplegic Marine is di...
In [58]: new_df['tags'] = new_df['tags'].apply(lambda x:x.lower())
```

```
C:\Users\parth\AppData\Local\Temp\ipykernel_15720\3214958533.py:1: SettingWithCopyWarning:
        A value is trying to be set on a copy of a slice from a DataFrame.
        Try using .loc[row indexer, col indexer] = value instead
        See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user guide/indexing.html#returning
        -a-view-versus-a-copy
          new_df['tags'] = new_df['tags'].apply(lambda x:x.lower())
In [59]: import nltk
         from nltk.stem.porter import PorterStemmer
         ps = PorterStemmer()
In [77]: def stem(text):
             y=[]
             for i in text.split():
                 y.append(ps.stem(i))
             return " ".join(y)
In [79]:
          new df["tags"].apply(stem)
Out[79]: 0
                  in the 22nd century, a parapleg marin is dispa...
          1
                  captain barbossa, long believ to be dead, ha c...
          2
                  a cryptic messag from bond' past send him on a...
          3
                  follow the death of district attorney harvey d...
          4
                  john carter is a war-weary, former militari ca...
          4804
                  el mariachi just want to play hi guitar and ca...
          4805
                  a newlyw couple' honeymoon is upend by the arr...
          4806
                  "signed, sealed, delivered" introduc a dedic q...
          4807
                  when ambiti new york attorney sam is sent to s...
          4808
                  ever sinc the second grade when he first saw h...
          Name: tags, Length: 4806, dtype: object
In [81]: new_df["tags"]= new_df["tags"].apply(stem)
```

```
C:\Users\parth\AppData\Local\Temp\ipykernel 15720\447794818.py:1: SettingWithCopyWarning:
        A value is trying to be set on a copy of a slice from a DataFrame.
        Try using .loc[row_indexer,col_indexer] = value instead
        See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning
        -a-view-versus-a-copy
          new_df["tags"] = new_df["tags"].apply(stem)
In [83]: new df.head(1)
Out[83]:
             movie id
                        title
                                                                 tags
               19995 Avatar in the 22nd century, a parapleg marin is dispa...
          0
In [85]: #converting the text into vectors (text vectorization) using bag of words
          from sklearn.feature extraction.text import CountVectorizer
          cv = CountVectorizer(max features = 5000 , stop words = "english")
In [87]: new_df.head(1)
Out[87]:
             movie id
                        title
                                                                 tags
          0
               19995 Avatar in the 22nd century, a parapleg marin is dispa...
          vectors = cv.fit_transform(new_df['tags']).toarray()
In [91]:
In [93]: vectors[0]
Out[93]: array([0, 0, 0, ..., 0, 0, 0], dtype=int64)
In [95]: features=cv.get_feature_names_out()
In [97]: print(features)
        ['000' '007' '10' ... 'zombies' 'zone' 'zoo']
In [99]: # for the vector we are not using any euclidean distance we are using cosine distance
         #the lower the angle between the 2 vector they are more similar to each other
```

```
from sklearn.metrics.pairwise import cosine_similarity
In [101...
          similarity = cosine similarity(vectors)
In [109...
          sorted(list(enumerate(similarity[0])),reverse=True,key=lambda x:x[1])[1:6]
In [117...
Out[117... [(1216, 0.2849014411490948),
           (539, 0.26940795304016235),
            (3730, 0.2676516895156553),
            (507, 0.2649064714130087),
            (582, 0.25182770057259657)]
         def recommend(movie):
In [177...
              movie_index=new_df[new_df["title"]== movie].index[0]
               distances = similarity[movie index]
               movies list = sorted(list(enumerate(distances)),reverse=True,key=lambda x:x[1])[1:6]
               for i in movies list:
                   print(new_df.iloc[i[0]].title)
               return
In [179...
          recommend('Spectre')
         Skyfall
         Quantum of Solace
         Never Say Never Again
         From Russia with Love
         Octopussy
          import pickle
In [149...
          pickle.dump(new_df,open('movies.pkl','wb'))
In [157...
         new_df['title'].values
In [159...
          array(['Avatar', "Pirates of the Caribbean: At World's End", 'Spectre',
Out[159...
                  ..., 'Signed, Sealed, Delivered', 'Shanghai Calling',
                  'My Date with Drew'], dtype=object)
          new_df.to_dict
In [161...
```

```
<bound method DataFrame.to_dict of</pre>
                                                     movie id
                                                                                                    title \
Out[161...
           0
                    19995
                                                               Avatar
           1
                      285 Pirates of the Caribbean: At World's End
           2
                   206647
                                                              Spectre
           3
                                               The Dark Knight Rises
                    49026
           4
                    49529
                                                          John Carter
                      . . .
           . . .
                     9367
                                                          El Mariachi
           4804
           4805
                    72766
                                                            Newlyweds
           4806
                   231617
                                           Signed, Sealed, Delivered
           4807
                   126186
                                                    Shanghai Calling
           4808
                    25975
                                                   My Date with Drew
                                                                tags
           0
                 in the 22nd century, a parapleg marin is dispa...
                 captain barbossa, long believ to be dead, ha c...
           1
           2
                 a cryptic messag from bond' past send him on a...
           3
                 follow the death of district attorney harvey d...
                 john carter is a war-weary, former militari ca...
           4
           . . .
                 el mariachi just want to play hi guitar and ca...
           4804
           4805
                 a newlyw couple' honeymoon is upend by the arr...
                 "signed, sealed, delivered" introduc a dedic q...
           4806
                 when ambiti new york attorney sam is sent to s...
           4807
                ever sinc the second grade when he first saw h...
           [4806 rows x 3 columns]>
          pickle.dump(new_df.to_dict(),open('movie_dict.pkl','wb'))
In [163...
          pickle.dump(similarity,open('similarity.pkl','wb'))
In [165...
 In [
```