```
import numpy as np
In [1]:
           import pandas as pd
          movies = pd.read csv('tmdb 5000 movies.csv')
In [2]:
           credits = pd.read csv('tmdb 5000 credits.csv')
          movies.head(1)
In [3]:
Out[3]:
                 budget
                                                                        id keywords original_language original_title overview popularity production_con
                             genres
                                                       homepage
                                                                                [{"id":
                                                                                                                               In the
                           [{"id": 28,
                                                                                1463,
                                                                                                                                22nd
                            "name":
                                                                                                                                                       [{"name": "In
                                                                               "name":
                                                                                                                            century, a
             237000000
                          "Action"},
                                     http://www.avatarmovie.com/ 19995
                                                                                                                   Avatar
                                                                                                                                       150.437577
                                                                                                                                                         Film Partne
                                                                                                        en
                                                                               "culture
                                                                                                                           paraplegic
                           {"id": 12,
                                                                               clash"},
                                                                                                                            Marine is
                             "nam...
                                                                                                                                  di...
                                                                                {"id":...
           credits.head()
In [4]
Out[4]:
              movie id
                                                           title
                                                                                                        cast
                                                                                                                                                         crew
          0
                 19995
                                                         Avatar
                                                                    [{"cast_id": 242, "character": "Jake Sully", "...
                                                                                                               [{"credit_id": "52fe48009251416c750aca23", "de...
          1
                         Pirates of the Caribbean: At World's End
                                                                  [{"cast_id": 4, "character": "Captain Jack Spa...
                                                                                                               [{"credit_id": "52fe4232c3a36847f800b579", "de...
          2
                206647
                                                                  [{"cast_id": 1, "character": "James Bond", "cr... [{"credit_id": "54805967c3a36829b5002c41", "de...
                                                        Spectre
          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...
```

marge both data set

```
In [5]: movies.merge(credits, on='title')
```

Out[5]:		budget	genres	homepage	id	keywords	original_language	original_title
	0	237000000	[{"id": 28, "name": "Action"}, {"id": 12, "nam	http://www.avatarmovie.com/	19995	[{"id": 1463, "name": "culture clash"}, {"id":	en	Avatar
	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
	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
	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
	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
	•••							
	4804	220000	[{"id": 28, "name": "Action"}, {"id": 80, "nam	NaN	9367	[{"id": 5616, "name": "united states\u2013mexi	es	El Mariachi
	4805	9000	[{"id": 35, "name":	NaN	72766	0	en	Newlyweds

	bu	dget	genres	homepage	id	keywords	original_language	original_title
			"Comedy"}, {"id": 10749, "					
	4806	0	[{"id": 35, "name": "Comedy"}, {"id": 18, "nam	http://www.hallmarkchannel.com/signedsealeddel	231617	[{"id": 248, "name": "date"}, {"id": 699, "nam	en	Signed, Sealed, Delivered
	4807	0	0	http://shanghaicalling.com/	126186	0	en	Shanghai Calling
	4808	0	[{"id": 99, "name": "Documentary"}]	NaN	25975	[{"id": 1523, "name": "obsession"}, {"id": 224	en	My Date with Drew
	1000							
In [6]:	movies.mer	ge(cr	redits, on='tit	le').shape				
Out[6]:	(4809, 23)							
In [7]:	movies.sha	pe						
Out[7]:	(4803, 20)							
In [8]:	credits.sh	аре						
Out[8]:	(4803, 4)							
In [9]:	movies = m	ovies	.merge(credits	, on='title')				
In [10]:	movies.hea	d(1)						

Out[10]:	budget	genres	homepage	id	keywords	original_language	original_title	overview	popularity	production_con
	0 237000000	[{"id": 28, "name": "Action"}, {"id": 12, "nam	http://www.avatarmovie.com/	19995	[{"id": 1463, "name": "culture clash"}, {"id":	en	Avatar	In the 22nd century, a paraplegic Marine is di	150.437577	[{"name": "ln Film Partne
	1 rows × 23 cc	lumns								

important column for analysis

- 1. genre
- 2. id
- 3. keywords
- 4. title
- 5. overview
- 6. cast
- 7. crew

```
In [11]: movies['original_language'].value_counts()
```

```
4510
          en
Out[11]:
                  70
                  32
          es
                  27
          zh
                  27
          de
         hi
                  19
         ja
                  16
         it
                  14
                  12
          ko
                  12
          cn
                  11
          ru
         pt
                   9
          da
                   7
                   5
          S۷
         nl
                   4
          fa
                   4
          th
                   3
          he
                   3
          ta
                   2
                   2
          CS
                   2
          ro
                   2
          id
          ar
                   2
          νi
                   1
          sl
                   1
                   1
          ps
          no
                   1
          ky
                   1
          hu
         pl
                   1
          af
          nb
          tr
         is
          XX
                   1
          te
                   1
         el
         Name: original_language, dtype: int64
```

```
In [12]: movies.info()
```

In [14]:

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 4809 entries, 0 to 4808
Data columns (total 23 columns):
     Column
                           Non-Null Count
                                           Dtype
     budget
                           4809 non-null
0
                                           int64
     genres
                           4809 non-null
                                           object
1
     homepage
                           1713 non-null
                                           object
                           4809 non-null
     id
                                           int64
                           4809 non-null
     keywords
                                           object
     original language
                           4809 non-null
                                           object
                           4809 non-null
     original title
                                           object
7
     overview
                           4806 non-null
                                           object
8
     popularity
                           4809 non-null
                                           float64
     production companies
                           4809 non-null
                                           object
    production_countries
                           4809 non-null
                                           object
11 release date
                           4808 non-null
                                           object
                           4809 non-null
                                           int64
12 revenue
13 runtime
                           4807 non-null
                                           float64
14 spoken languages
                           4809 non-null
                                           object
15 status
                           4809 non-null
                                           object
16 tagline
                           3965 non-null
                                           object
17 title
                           4809 non-null
                                           object
                           4809 non-null
                                           float64
18 vote average
19 vote count
                           4809 non-null
                                           int64
 20 movie id
                           4809 non-null
                                           int64
21 cast
                           4809 non-null
                                           object
 22 crew
                           4809 non-null
                                           object
dtypes: float64(3), int64(5), object(15)
memory usage: 901.7+ KB
movies = movies[['movie id','title','overview','genres','keywords','cast','crew']]
movies.head()
```

Out[14]

]:	m	ovie_id	title	overview	genres	keywords	cast	crew
	0	19995	Avatar	In the 22nd century, a paraplegic Marine is di	[{"id": 28, "name": "Action"}, {"id": 12, "nam	[{"id": 1463, "name": "culture clash"}, {"id":	[{"cast_id": 242, "character": "Jake Sully", "	[{"credit_id": "52fe48009251416c750aca23", "de
	1	285	Pirates of the Caribbean: At World's End	Captain Barbossa, long believed to be dead, ha	[{"id": 12, "name": "Adventure"}, {"id": 14, "		[{"cast_id": 4, "character": "Captain Jack Spa	[{"credit_id": "52fe4232c3a36847f800b579", "de
	2	206647	Spectre	A cryptic message from Bond's past sends him o	[{"id": 28, "name": "Action"}, {"id": 12, "nam	[{"id": 470, "name": "spy"}, {"id": 818, "name	[{"cast_id": 1, "character": "James Bond", "cr	[{"credit_id": "54805967c3a36829b5002c41", "de
	3	49026	The Dark Knight Rises	Following the death of District Attorney Harve	[{"id": 28, "name": "Action"}, {"id": 80, "nam	[{"id": 849, "name": "dc comics"}, {"id": 853,	[{"cast_id": 2, "character": "Bruce Wayne / Ba	[{"credit_id": "52fe4781c3a36847f81398c3", "de
	4	49529	John Carter	John Carter is a war-weary, former military ca	[{"id": 28, "name": "Action"}, {"id": 12, "nam	[{"id": 818, "name": "based on novel"}, {"id":	[{"cast_id": 5, "character": "John Carter", "c	[{"credit_id": "52fe479ac3a36847f813eaa3", "de

Preprocessing

```
#Check the missing value
In [15]:
         movies.isnull().sum()
         movie_id
                     0
Out[15]:
         title
         overview
         genres
         keywords
         cast
         crew
         dtype: int64
         # Three(3) movies that do not have overview so we drop them
In [17]:
         movies.dropna(inplace=True)
```

```
#check the duplicate data
In [18]:
         movies.duplicated().sum()
Out[18]:
In [19]: movies.iloc[0].genres
         '[{"id": 28, "name": "Action"}, {"id": 12, "name": "Adventure"}, {"id": 14, "name": "Fantasy"}, {"id": 878, "name": "Sc
Out[19]:
         ience Fiction"}]'
In [20]: #string given error so we have to convert string of list into list so we import ast library
         import ast
In [21]: def convert(obj):
             L = []
             for i in ast.literal eval(obj):
                 L.append(i['name'])
             return L
         movies['genres']= movies['genres'].apply(convert)
         movies.head()
In [23]:
```

Out[23]:		movie_id	title	overview	genres	keywords	cast	crew
	0	19995	Avatar	In the 22nd century, a paraplegic Marine is di	[Action, Adventure, Fantasy, Science Fiction]	[{"id": 1463, "name": "culture clash"}, {"id":	[{"cast_id": 242, "character": "Jake Sully", "	[{"credit_id": "52fe48009251416c750aca23", "de
	1	285	Pirates of the Caribbean: At World's End	Captain Barbossa, long believed to be dead, ha	[Adventure, Fantasy, Action]	[{"id": 270, "name": "ocean"}, {"id": 726, "na	[{"cast_id": 4, "character": "Captain Jack Spa	[{"credit_id": "52fe4232c3a36847f800b579", "de
	2	206647	Spectre	A cryptic message from Bond's past sends him o	[Action, Adventure, Crime]	[{"id": 470, "name": "spy"}, {"id": 818, "name	[{"cast_id": 1, "character": "James Bond", "cr	[{"credit_id": "54805967c3a36829b5002c41", "de
	3	49026	The Dark Knight Rises	Following the death of District Attorney Harve	[Action, Crime, Drama, Thriller]	[{"id": 849, "name": "dc comics"}, {"id": 853,	[{"cast_id": 2, "character": "Bruce Wayne / Ba	[{"credit_id": "52fe4781c3a36847f81398c3", "de
	4	49529	John Carter	John Carter is a war-weary, former military ca	[Action, Adventure, Science Fiction]	[{"id": 818, "name": "based on novel"}, {"id":	[{"cast_id": 5, "character": "John Carter", "c	[{"credit_id": "52fe479ac3a36847f813eaa3", "de
In [24]:	mov	vies['key	words'] = movi	es['keywords'].ap	oply(convert)			
In [25]:	mov	vies.head	()					

Out[25]:		movie_id	title	overview	genres	keywords	cast	crew
	0	19995	Avatar	In the 22nd century, a paraplegic Marine is di	[Action, Adventure, Fantasy, Science Fiction]	[culture clash, future, space war, space colon	[{"cast_id": 242, "character": "Jake Sully", "	[{"credit_id": "52fe48009251416c750aca23", "de
	1	285	Pirates of the Caribbean: At World's End	Captain Barbossa, long believed to be dead, ha	[Adventure, Fantasy, Action]	[ocean, drug abuse, exotic island, east india	[{"cast_id": 4, "character": "Captain Jack Spa	[{"credit_id": "52fe4232c3a36847f800b579", "de
	2	206647	Spectre	A cryptic message from Bond's past sends him o	[Action, Adventure, Crime]	[spy, based on novel, secret agent, sequel, mi	[{"cast_id": 1, "character": "James Bond", "cr	[{"credit_id": "54805967c3a36829b5002c41", "de
	3	49026	The Dark Knight Rises	Following the death of District Attorney Harve	[Action, Crime, Drama, Thriller]	[dc comics, crime fighter, terrorist, secret i	[{"cast_id": 2, "character": "Bruce Wayne / Ba	[{"credit_id": "52fe4781c3a36847f81398c3", "de
	4	49529	John Carter	John Carter is a war-weary, former military ca	[Action, Adventure, Science Fiction]	[based on novel, mars, medallion, space travel	[{"cast_id": 5, "character": "John Carter", "c	[{"credit_id": "52fe479ac3a36847f813eaa3", "de
In [26]:	def		= 0 n ast.literal_counter != 3: L.append(i['n.counter+= 1 e: break	, ,				
In [27]:	mov	ies['cas	t'] = movies['	cast'].apply(con	vert3)			
In [28]:	mov	ies.head	()					

Out[28]:		movie_id	title	overview	genres	keywords	cast	crew
	0	19995	Avatar	In the 22nd century, a paraplegic Marine is di	[Action, Adventure, Fantasy, Science Fiction]	[culture clash, future, space war, space colon	[Sam Worthington, Zoe Saldana, Sigourney Weaver]	[{"credit_id": "52fe48009251416c750aca23", "de
	1	285	Pirates of the Caribbean: At World's End	Captain Barbossa, long believed to be dead, ha	[Adventure, Fantasy, Action]	[ocean, drug abuse, exotic island, east india 	[Johnny Depp, Orlando Bloom, Keira Knightley]	[{"credit_id": "52fe4232c3a36847f800b579", "de
	2	206647	Spectre	A cryptic message from Bond's past sends him o	[Action, Adventure, Crime]	[spy, based on novel, secret agent, sequel, mi	[Daniel Craig, Christoph Waltz, Léa Seydoux]	[{"credit_id": "54805967c3a36829b5002c41", "de
	3	49026	The Dark Knight Rises	Following the death of District Attorney Harve	[Action, Crime, Drama, Thriller]	[dc comics, crime fighter, terrorist, secret i	[Christian Bale, Michael Caine, Gary Oldman]	[{"credit_id": "52fe4781c3a36847f81398c3", "de
	4	49529	John Carter	John Carter is a war-weary, former military ca	[Action, Adventure, Science Fiction]	[based on novel, mars, medallion, space travel	[Taylor Kitsch, Lynn Collins, Samantha Morton]	[{"credit_id": "52fe479ac3a36847f813eaa3", "de
In [29]:	mov	ies['cre	w'][0]					

localhost:8888/nbconvert/html/Desktop/Machine Learning/Recommend Content based/Recommendation system Machine Learning.ipynb?download=false

Out[29]:

'[{"credit id": "52fe48009251416c750aca23", "department": "Editing", "gender": 0, "id": 1721, "job": "Editor", "name": "Stephen E. Rivkin"}, {"credit id": "539c47ecc3a36810e3001f87", "department": "Art", "gender": 2, "id": 496, "job": "Pr oduction Design", "name": "Rick Carter"}, {"credit id": "54491c89c3a3680fb4001cf7", "department": "Sound", "gender": 0, "id": 900, "job": "Sound Designer", "name": "Christopher Boyes"}, {"credit id": "54491cb70e0a267480001bd0", "departmen t": "Sound", "gender": 0, "id": 900, "job": "Supervising Sound Editor", "name": "Christopher Boyes"}, {"credit id": "53 9c4a4cc3a36810c9002101", "department": "Production", "gender": 1, "id": 1262, "job": "Casting", "name": "Mali Finn"}, {"credit id": "5544ee3b925141499f0008fc", "department": "Sound", "gender": 2, "id": 1729, "job": "Original Music Compos er", "name": "James Horner"}, {"credit id": "52fe48009251416c750ac9c3", "department": "Directing", "gender": 2, "id": 2 710, "job": "Director", "name": "James Cameron"}, {"credit id": "52fe48009251416c750ac9d9", "department": "Writing", "g ender": 2, "id": 2710, "job": "Writer", "name": "James Cameron"}, {"credit id": "52fe48009251416c750aca17", "departmen t": "Editing", "gender": 2, "id": 2710, "job": "Editor", "name": "James Cameron"}, {"credit id": "52fe48009251416c750ac a29", "department": "Production", "gender": 2, "id": 2710, "job": "Producer", "name": "James Cameron"}, {"credit id": "52fe48009251416c750aca3f", "department": "Writing", "gender": 2, "id": 2710, "job": "Screenplay", "name": "James Camer on"}, {"credit id": "539c4987c3a36810ba0021a4", "department": "Art", "gender": 2, "id": 7236, "job": "Art Direction", "name": "Andrew Menzies"}, {"credit id": "549598c3c3a3686ae9004383", "department": "Visual Effects", "gender": 0, "id": 6690, "job": "Visual Effects Producer", "name": "Jill Brooks"}, {"credit id": "52fe48009251416c750aca4b", "department": "Production", "gender": 1, "id": 6347, "job": "Casting", "name": "Margery Simkin"}, {"credit_id": "570b6f419251417da700 32fe", "department": "Art", "gender": 2, "id": 6878, "job": "Supervising Art Director", "name": "Kevin Ishioka"}, {"cre dit id": "5495a0fac3a3686ae9004468", "department": "Sound", "gender": 0, "id": 6883, "job": "Music Editor", "name": "Di ck Bernstein"}, {"credit id": "54959706c3a3686af3003e81", "department": "Sound", "gender": 0, "id": 8159, "job": "Sound Effects Editor", "name": "Shannon Mills"}, {"credit id": "54491d58c3a3680fb1001ccb", "department": "Sound", "gender": 0, "id": 8160, "job": "Foley", "name": "Dennie Thorpe"}, {"credit id": "54491d6cc3a3680fa5001b2c", "department": "Soun d", "gender": 0, "id": 8163, "job": "Foley", "name": "Jana Vance"}, {"credit id": "52fe48009251416c750aca57", "departme nt": "Costume & Make-Up", "gender": 1, "id": 8527, "job": "Costume Design", "name": "Deborah Lynn Scott"}, {"credit i d": "52fe48009251416c750aca2f", "department": "Production", "gender": 2, "id": 8529, "job": "Producer", "name": "Jon La ndau"}, {"credit_id": "539c4937c3a36810ba002194", "department": "Art", "gender": 0, "id": 9618, "job": "Art Direction", "name": "Sean Haworth"}, {"credit id": "539c49b6c3a36810c10020e6", "department": "Art", "gender": 1, "id": 12653, "jo b": "Set Decoration", "name": "Kim Sinclair"}, {"credit id": "570b6f2f9251413a0e00020d", "department": "Art", "gender": 1, "id": 12653, "job": "Supervising Art Director", "name": "Kim Sinclair"}, {"credit id": "54491a6c0e0a26748c001b19", "department": "Art", "gender": 2, "id": 14350, "job": "Set Designer", "name": "Richard F. Mays"}, {"credit id": "56928c f4c3a3684cff0025c4", "department": "Production", "gender": 1, "id": 20294, "job": "Executive Producer", "name": "Laeta Kalogridis"}, {"credit id": "52fe48009251416c750aca51", "department": "Costume & Make-Up", "gender": 0, "id": 17675, "j ob": "Costume Design", "name": "Mayes C. 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In [32]: movies.head()

Out[32]:		movie_id	title	overview	genres	keywords	cast	crew
	0	19995	Avatar	In the 22nd century, a paraplegic Marine is di	[Action, Adventure, Fantasy, Science Fiction]	[culture clash, future, space war, space colon	[Sam Worthington, Zoe Saldana, Sigourney Weaver]	[James Cameron]
	1	285	Pirates of the Caribbean: At World's End	Captain Barbossa, long believed to be dead, ha	[Adventure, Fantasy, Action]	[ocean, drug abuse, exotic island, east india	[Johnny Depp, Orlando Bloom, Keira Knightley]	[Gore Verbinski]
	2	206647	Spectre	A cryptic message from Bond's past sends him o	[Action, Adventure, Crime]	[spy, based on novel, secret agent, sequel, mi	[Daniel Craig, Christoph Waltz, Léa Seydoux]	[Sam Mendes]
	3	49026	The Dark Knight Rises	Following the death of District Attorney Harve	[Action, Crime, Drama, Thriller]	[dc comics, crime fighter, terrorist, secret i	[Christian Bale, Michael Caine, Gary Oldman]	[Christopher Nolan]
	4	49529	John Carter	John Carter is a war- weary, former military ca	[Action, Adventure, Science Fiction]	[based on novel, mars, medallion, space travel	[Taylor Kitsch, Lynn Collins, Samantha Morton]	[Andrew Stanton]
In [33]:	mo	vies['over	view'][0]					
Out[33]:				plegic Marine is di ecting an alien civ		oon Pandora on a uni	que mission, but bec	omes torn betw
In [34]:				ng so we convert it nbda x: x.split())	into list			
Out[34]:	0 1 2 3 4 486 486 486 486 Nan	[Capt [A, c [Foli]John 04 [El, 05 [A, r 06 ["Sig 07 [Wher 08 [Ever	tain, Barbossa,, cryptic, message lowing, the, dea n, Carter, is, a Mariachi, just, newlywed, couple gned,, Sealed,, n, ambitious, Ne r, since, the, s	cury,, a, paraplegic long, believed, to e, from, Bond's, pas oth, of, District, A e, war-weary,, forme wants, to, play, he's, honeymoon, is, Delivered", introduew, York, attorney, econd, grade, when, e, dtype: object	, be, d t, send ttorney r, mili is, gui upended ces, a, Sam, is			
In [35]:		vies[<mark>'over</mark> vies.head(['overview'].apply(1	ambda x: x.split())		

Out[35]

]:	n	novie_id	title	overview	genres	keywords	cast	crew
	0	19995	Avatar	[In, the, 22nd, century,, a, paraplegic, Marin	[Action, Adventure, Fantasy, Science Fiction]	[culture clash, future, space war, space colon	[Sam Worthington, Zoe Saldana, Sigourney Weaver]	[James Cameron]
	1	285	Pirates of the Caribbean: At World's End	[Captain, Barbossa,, long, believed, to, be, d	[Adventure, Fantasy, Action]	[ocean, drug abuse, exotic island, east india	[Johnny Depp, Orlando Bloom, Keira Knightley]	[Gore Verbinski]
	2	206647	Spectre	[A, cryptic, message, from, Bond's, past, send	[Action, Adventure, Crime]	[spy, based on novel, secret agent, sequel, mi	[Daniel Craig, Christoph Waltz, Léa Seydoux]	[Sam Mendes]
	3	49026	The Dark Knight Rises	[Following, the, death, of, District, Attorney	[Action, Crime, Drama, Thriller]	[dc comics, crime fighter, terrorist, secret i	[Christian Bale, Michael Caine, Gary Oldman]	[Christopher Nolan]
	4	49529	John Carter	[John, Carter, is, a, war-weary,, former, mili	[Action, Adventure, Science Fiction]	[based on novel, mars, medallion, space travel	[Taylor Kitsch, Lynn Collins, Samantha Morton]	[Andrew Stanton]

Apply Transformation

```
In [36]:
    '''remove the space between the words like sam worthington so this one full name
    but it count as a seperate tag so we have to remove the sapce between the full name like samworthington'''
    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])
In [37]: movies.head()
```

Out[37]:		movie_id	title	overview	genres	keywords	cast	crew
	0	19995	Avatar	[In, the, 22nd, century,, a, paraplegic, Marin	[Action, Adventure, Fantasy, ScienceFiction]	[cultureclash, future, spacewar, spacecolony,	[SamWorthington, ZoeSaldana, SigourneyWeaver]	[JamesCameron]
	1	285	Pirates of the Caribbean: At World's End	[Captain, Barbossa,, long, believed, to, be, d	[Adventure, Fantasy, Action]	[ocean, drugabuse, exoticisland, eastindiatrad	[JohnnyDepp, OrlandoBloom, KeiraKnightley]	[GoreVerbinski]
	2	206647	Spectre	[A, cryptic, message, from, Bond's, past, send	[Action, Adventure, Crime]	[spy, basedonnovel, secretagent, sequel, mi6,	[Daniel Craig, Christoph Waltz, Léa Seydoux]	[SamMendes]
	3	49026	The Dark Knight Rises	[Following, the, death, of, District, Attorney	[Action, Crime, Drama, Thriller]	[dccomics, crimefighter, terrorist, secretiden	[ChristianBale, MichaelCaine, GaryOldman]	[ChristopherNolan]
	4	49529	John Carter	[John, Carter, is, a, war-weary,, former, mili	[Action, Adventure, ScienceFiction]	[basedonnovel, mars, medallion, spacetravel, p	[TaylorKitsch, LynnCollins, SamanthaMorton]	[AndrewStanton]
In [50]:				concatenate the aloverview'] + movie		ies['keywords'] + mo	ovies['cast'] + movies	s['crew']
In [51]:	mov	vies.head	()					

Out[51]:		movie_id	title	overview	genres	keywords	cast	crew	tags
	0	19995	Avatar	[In, the, 22nd, century,, a, paraplegic, Marin	[Action, Adventure, Fantasy, ScienceFiction]	[cultureclash, future, spacewar, spacecolony,	[SamWorthington, ZoeSaldana, SigourneyWeaver]	[JamesCameron]	[In, the, 22nd, century,, a, paraplegic, Marin
	1	285	Pirates of the Caribbean: At World's End	[Captain, Barbossa,, long, believed, to, be, d	[Adventure, Fantasy, Action]	[ocean, drugabuse, exoticisland, eastindiatrad	[JohnnyDepp, OrlandoBloom, KeiraKnightley]	[GoreVerbinski]	[Captain, Barbossa,, long, believed, to, be, d
	2	206647	Spectre	[A, cryptic, message, from, Bond's, past, send	[Action, Adventure, Crime]	[spy, basedonnovel, secretagent, sequel, mi6,	[DanielCraig, ChristophWaltz, LéaSeydoux]	[SamMendes]	[A, cryptic, message, from, Bond's, past, send
	3	49026	The Dark Knight Rises	[Following, the, death, of, District, Attorney	[Action, Crime, Drama, Thriller]	[dccomics, crimefighter, terrorist, secretiden	[ChristianBale, MichaelCaine, GaryOldman]	[ChristopherNolan]	[Following, the, death, of, District, Attorney
	4	49529	John Carter	[John, Carter, is, a, war-weary,, former, mili	[Action, Adventure, ScienceFiction]	[basedonnovel, mars, medallion, spacetravel, p	[TaylorKitsch, LynnCollins, SamanthaMorton]	[AndrewStanton]	[John, Carter, is, a, war-weary,, former, mili
In [52]:				e with movie i _id', 'title',	d ,title and tag 'tags']]	ŢS			
In [56]:	neı	w_df['tag	s'] = new_df	['tags'].apply	(lambda x:" ".jo	pin(x))			
	A v	/alue is / using .	trying to be loc[row_index	set on a copy ker,col_indexe	of a slice from r] = value inste	n a DataFrame. ead	tingWithCopyWarni		html#neturning_a
	-vi	lew-versu	s-a-copy		ly(lambda x:" ".		s-uocs/stable/user_	_gurue/indexing.	ircilit#i ecui iitiig-a
In [57]:	neı	w_df.head	()						

```
Out[57]:
             movie id
                                                  title
                                                                                            tags
          0
               19995
                                                          In the 22nd century, a paraplegic Marine is di...
                                                 Avatar
                      Pirates of the Caribbean: At World's End
                                                         Captain Barbossa, long believed to be dead, ha...
          1
          2
              206647
                                                Spectre A cryptic message from Bond's past sends him o...
          3
               49026
                                     The Dark Knight Rises
                                                          Following the death of District Attorney Harve...
          4
               49529
                                             John Carter
                                                          John Carter is a war-weary, former military ca...
          #import after the vectors features names
          import nltk
          from nltk.stem.porter import PorterStemmer
In [72]:
          ps = PorterStemmer()
In [77]:
          def stem(text):
              v = []
              for i in text.split():
                  y.append(ps.stem(i))
              return " ".join(y)
In [79]:
         new df['tags'] = new df['tags'].apply(stem)
          C:\Users\lenovo\AppData\Local\Temp\ipykernel 8244\3213734980.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)
         new_df['tags'][0]
In [58]:
          'In the 22nd century, a paraplegic Marine is dispatched to the moon Pandora on a unique mission, but becomes torn betwe
Out[58]:
          en following orders and protecting an alien civilization. Action Adventure Fantasy ScienceFiction cultureclash future s
          pacewar spacecolony society spacetravel futuristic romance space alien tribe alienplanet cgi marine soldier battle love
          affair antiwar powerrelations mindandsoul 3d SamWorthington ZoeSaldana SigourneyWeaver JamesCameron'
In [59]:
         new_df['tags'] = new_df['tags'].apply(lambda x:x.lower())
```

```
C:\Users\lenovo\AppData\Local\Temp\ipykernel_8244\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 [60]: new_df.head()

tags	title	movie_id]: _
in the 22nd century, a paraplegic marine is di	Avatar	0 19995	
captain barbossa, long believed to be dead, ha	Pirates of the Caribbean: At World's End	1 285	
a cryptic message from bond's past sends him o	Spectre	2 206647	
following the death of district attorney harve	The Dark Knight Rises	3 49026	
john carter is a war-weary, former military ca	John Carter	4 49529	

```
In [61]: new_df['tags'][0]
```

'in the 22nd century, a paraplegic marine is dispatched to the moon pandora on a unique mission, but becomes torn betwe en following orders and protecting an alien civilization. action adventure fantasy sciencefiction cultureclash future s pacewar spacecolony society spacetravel futuristic romance space alien tribe alienplanet cgi marine soldier battle love affair antiwar powerrelations mindandsoul 3d samworthington zoesaldana sigourneyweaver jamescameron'

```
In [62]: new_df['tags'][1]
```

"captain barbossa, long believed to be dead, has come back to life and is headed to the edge of the earth with will tur ner and elizabeth swann. but nothing is quite as it seems. adventure fantasy action ocean drugabuse exoticisland eastin diatradingcompany loveofone'slife traitor shipwreck strongwoman ship alliance calypso afterlife fighter pirate swashbuc kler aftercreditsstinger johnnydepp orlandobloom keiraknightley goreverbinski"

Feature Extraction

```
In [80]: from sklearn.feature_extraction.text import CountVectorizer
    cv = CountVectorizer(max_features=5000,stop_words='english')

In [81]: # cv.fit_transform(new_df['tags']).toarray()
    #cv.fit_transform(new_df['tags']).toarray().shape
```

```
vectors = cv.fit_transform(new_df['tags']).toarray()
In [82]:
         vectors
         array([[0, 0, 0, ..., 0, 0, 0],
Out[82]:
                 [0, 0, 0, \ldots, 0, 0, 0],
                 [0, 0, 0, ..., 0, 0, 0]], dtype=int64)
In [83]: vectors[0]
         array([0, 0, 0, ..., 0, 0, 0], dtype=int64)
Out[83]:
In [84]: cv.get_feature_names()
          C:\Users\lenovo\anaconda3\lib\site-packages\sklearn\utils\deprecation.py:87: FutureWarning: Function get feature names
          is deprecated; get feature names is deprecated in 1.0 and will be removed in 1.2. Please use get feature names out inst
          ead.
            warnings.warn(msg, category=FutureWarning)
```

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Out[84]: ['000',
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          'cook',
          'cool',
          'cooper',
          'cop',
          'cope',
          ...]
         ['loved', 'love', 'loving']
         ['loved', 'love', 'loving']
Out[74]:
         ps.stem('loving')
In [76]:
Out[76]:
In [85]: from sklearn.metrics.pairwise import cosine similarity
         #check the similiarity score of first with all
In [87]:
         #other movies like haar movie ka haar ke sath distance find out krna hai similarity nikalni hai , 1 means similiarity z
         #0 means similarity kaam hai
         similarity = cosine similarity(vectors)
         similarity
In [88]:
         array([[1.
                          , 0.08346223, 0.0860309 , ..., 0.04499213, 0.
Out[88]:
                [0.08346223, 1. , 0.06063391, ..., 0.02378257, 0.
                 0.02615329],
                [0.0860309, 0.06063391, 1., 0.02451452, 0.
                 0.
                          ],
                [0.04499213, 0.02378257, 0.02451452, ..., 1. , 0.03962144,
                 0.04229549],
                                , 0. , ..., 0.03962144, 1.
                [0.
                          , 0.
                 0.08714204],
                [0.
                          , 0.02615329, 0. , ..., 0.04229549, 0.08714204,
                          ]])
                 1.
```

```
new df[new df['title'] == 'Batman Begins'].index[0]
 In [89]:
Out[89]:
          # first jab movie find out krne ke liye firts have to find out index,
          # index = new df[new df['title'] == 'batman begins'].index[0]
          #distance nikalne hain
          #then sort distances=> distances was in array
          #sorted(similarity[0])
          #distances = sorted(similarity[index])
         movie_index = new_df[new_df['title'] == 'Batman Begins'].index[0]
 In [90]:
In [91]: movie_index
Out[91]:
          sorted(similarity[0][-10:-1])
 In [94]:
          [0.0,
Out[94]:
           0.0,
           0.0,
           0.0,
           0.019252140716412975,
           0.04223886030955117,
           0.04499212706658476,
           0.046829290579084706,
           0.052631578947368425]
          #List(enumerate(similarity[0]))
 In [98]:
          \#sorted(list(enumerate(similarity[0])), reverse=True , key = lambda x: x[1])
          sorted(list(enumerate(similarity[0])), reverse=True , key = lambda x: x[1])[1:6]
          [(1216, 0.28676966733820225),
Out[98]:
           (2409, 0.26901379342448517),
           (3730, 0.2605130246476754),
           (507, 0.255608593705383),
           (539, 0.2503866978335957)]
          def recommend(movie):
In [101...
              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)

In [105... recommend('Avatar')

Aliens vs Predator: Requiem
Aliens
Falcon Rising
Independence Day
Titan A.E.

In [103... new_df.iloc[1216].title

Out[103]: 'Aliens vs Predator: Requiem'

In []:
```