```
In [1]:
          #Import Libraries
          import os
          import numpy as np
          import pandas as pd
          import warnings
          warnings.filterwarnings('ignore')
In [2]:
          #import data set, movies and credits
          movies = pd.read_csv('movies.csv')
          credits = pd.read_csv('credits.csv')
In [3]:
          movies.head(2)
Out[3]:
                  budget
                                genres
                                                                    homepage
                                                                                    id keywords
                                                                                                  original_laı
                                                                                            [{"id":
                              [{"id": 28,
                                                                                            1463,
                               "name":
                                                                                          "name":
             237000000
                              "Action"},
                                                     http://www.avatarmovie.com/ 19995
                                                                                          "culture
                               {"id": 12,
                                                                                          clash"},
                                "nam...
                                                                                           {"id":...
                                                                                        [{"id": 270,
                              [{"id": 12,
                                                                                          "name":
                               "name":
              300000000
                                                                                  285
                                                                                         "ocean"},
                                        http://disney.go.com/disneypictures/pirates/
                          "Adventure"},
                                                                                        {"id": 726,
                            {"id": 14, "...
                                                                                            "na...
In [4]:
          credits.head(2)
Out[4]:
                                          title
              movie_id
                                                                  cast
                                                                                                       crew
                                                         [{"cast id": 242,
                                                                                                [{"credit id":
           0
                  19995
                                                 "character": "Jake Sully",
                                        Avatar
                                                                          "52fe48009251416c750aca23", "de...
                                  Pirates of the
                                                [{"cast_id": 4, "character":
                                                                                                [{"credit_id":
           1
                    285
                          Caribbean: At World's
                                                                           "52fe4232c3a36847f800b579", "de...
                                                     "Captain Jack Spa...
                                          End
In [5]:
          print(movies.shape)
          print()
          print(credits.shape)
           (4803, 20)
          (4803, 4)
```

```
In [6]: print(movies.info())
    print()
    print(credits.info())
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 4803 entries, 0 to 4802
Data columns (total 20 columns):

```
#
    Column
                         Non-Null Count Dtype
   ----
                         -----
---
                                        ----
                                        int64
0
    budget
                         4803 non-null
                                        object
1
    genres
                         4803 non-null
2
    homepage
                         1712 non-null
                                        object
3
    id
                         4803 non-null
                                        int64
4
   keywords
                         4803 non-null
                                        object
5
    original_language
                         4803 non-null
                                        object
6
                         4803 non-null
                                        object
   original_title
7
    overview
                         4800 non-null
                                        object
8
    popularity
                         4803 non-null
                                        float64
    production_companies 4803 non-null
                                        object
10 production_countries 4803 non-null
                                        object
11 release_date
                         4802 non-null
                                        object
12 revenue
                                        int64
                         4803 non-null
                         4801 non-null
13 runtime
                                        float64
14 spoken_languages
                                        object
                         4803 non-null
15 status
                         4803 non-null
                                        object
16 tagline
                         3959 non-null
                                        object
17 title
                         4803 non-null
                                        object
18 vote_average
                                        float64
                        4803 non-null
19 vote_count
                         4803 non-null
                                        int64
```

dtypes: float64(3), int64(4), object(13)

memory usage: 750.6+ KB

None

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 4803 entries, 0 to 4802
Data columns (total 4 columns):

#	Column	Non-Null Count	Dtype
0	<pre>movie_id</pre>	4803 non-null	int64
1	title	4803 non-null	object
2	cast	4803 non-null	object
3	crew	4803 non-null	object

dtypes: int64(1), object(3)
memory usage: 150.2+ KB

None

```
In [9]: movies.head()
```

Out[9]:

	budget	genres	homepage	id	keywords	original _.
0	237000000	[{"id": 28, "name": "Action"}, {"id": 12, "nam	http://www.avatarmovie.com/	19995	[{"id": 1463, "name": "culture clash"}, {"id":	
1	300000000	[{"id": 12, "name": "Adventure"}, {"id": 14, "	http://disney.go.com/disneypictures/pirates/	285	[{"id": 270, "name": "ocean"}, {"id": 726, "na	
2	245000000	[{"id": 28, "name": "Action"}, {"id": 12, "nam	http://www.sonypictures.com/movies/spectre/	206647	[{"id": 470, "name": "spy"}, {"id": 818, "name	
3	250000000	[{"id": 28, "name": "Action"}, {"id": 80, "nam	http://www.thedarkknightrises.com/		[{"id": 849, "name": "dc comics"}, {"id": 853,	
4	260000000	[{"id": 28, "name": "Action"}, {"id": 12, "nam	http://movies.disney.com/john-carter	49529	[{"id": 818, "name": "based on novel"}, {"id":	

5 rows × 23 columns

dtype='object')

```
In [10]: movies.shape
Out[10]: (4809, 23)
In [11]: movies.columns
Out[11]: Index(['budget', 'genres', 'homepage', 'id', 'keywords', 'original_language', 'original_title', 'overview', 'popularity', 'production_companies',
```

'production_countries', 'release_date', 'revenue', 'runtime', 'spoken_languages', 'status', 'tagline', 'title', 'vote_average',

'vote_count', 'movie_id', 'cast', 'crew'],

```
In [12]: #delete unwanted columns
movies = movies[['movie_id','title','overview','genres','keywords','cast', '
```

In [13]: movies.head()

Out[13]:

(cast	keywords	genres	overview	title	movie_id	
[{"credir "52fe48009251416c750ac; '	[{"cast_id": 242, "character": "Jake Sully", "	[{"id": 1463, "name": "culture clash"}, {"id":	[{"id": 28, "name": "Action"}, {"id": 12, "nam	In the 22nd century, a paraplegic Marine is di	Avatar	19995	0
[{"credir "52fe4232c3a36847f800b! '	[{"cast_id": 4, "character": "Captain Jack Spa	[{"id": 270, "name": "ocean"}, {"id": 726, "na	[{"id": 12, "name": "Adventure"}, {"id": 14, "	Captain Barbossa, long believed to be dead, ha	Pirates of the Caribbean: At World's End	285	1
[{"credir "54805967c3a36829b5002 _r	[{"cast_id": 1, "character": "James Bond", "cr	[{"id": 470, "name": "spy"}, {"id": 818, "name	[{"id": 28, "name": "Action"}, {"id": 12, "nam	A cryptic message from Bond's past sends him 0	Spectre	206647	2
[{"credi "52fe4781c3a36847f8139 '	[{"cast_id": 2, "character": "Bruce Wayne / Ba	[{"id": 849, "name": "dc comics"}, {"id": 853,	[{"id": 28, "name": "Action"}, {"id": 80, "nam	Following the death of District Attorney Harve	The Dark Knight Rises	49026	3
[{"credir "52fe479ac3a36847f813ea '	[{"cast_id": 5, "character": "John Carter", "c	[{"id": 818, "name": "based on novel"}, {"id":	[{"id": 28, "name": "Action"}, {"id": 12, "nam	John Carter is a war- weary, former military ca	John Carter	49529	4
							4

```
In [14]: movies['genres'][0]
```

```
In [15]: movies['genres'][1]
```

```
In [16]:
           # check missing data
           movies.isnull().sum()
Out[16]:
           movie_id
                          0
           title
                          0
           overview
                          3
           genres
                          0
           keywords
                          0
                          0
           cast
                          0
           crew
           dtype: int64
           #drop null values
In [17]:
           movies.dropna(inplace=True)
In [18]:
           movies.isnull().sum()
Out[18]: movie id
                          0
           title
                          0
                          0
           overview
           genres
                          0
           keywords
                          0
           cast
                          0
                          0
           crew
           dtype: int64
In [19]:
           # To extract details from dictionaries - ast
           import ast
In [20]:
           def convert(text):
                L = []
                for i in ast.literal_eval(text):
                     L.append(i['name'])
                return L
In [21]:
           movies.head(2)
Out[21]:
               movie_id
                                title
                                      overview
                                                     genres keywords
                                                                               cast
                                                                                                            C
                                                                  [{"id":
                                          In the
                                                    [{"id": 28,
                                                                          [{"cast_id":
                                          22nd
                                                                  1463,
                                                     "name":
                                                                               242,
                                                                                                      [{"credit
                                                                "name":
                                      century, a
                                                                         "character":
            0
                   19995
                                                    "Action"},
                                                                                     "52fe48009251416c750aca
                              Avatar
                                     paraplegic
                                                                 "culture
                                                    {"id": 12,
                                                                              "Jake
                                       Marine is
                                                                 clash"},
                                                      "nam...
                                                                           Sully", "...
                                           di...
                                                                 {"id":...
                                        Captain
                                                              [{"id": 270,
                                     Barbossa,
                           Pirates of
                                                                          [{"cast_id":
                                                    [{"id": 12,
                                                                                                      [{"credit
                                                                "name":
                                 the
                                           lona
                                                     "name":
            1
                     285 Caribbean:
                                                               "ocean"},
                                                                         "character":
                                                                                      "52fe4232c3a36847f800b5
                                       believed
                                                 "Adventure"},
                           At World's
                                                               {"id": 726,
                                                                            "Captain
                                          to be
                                                  {"id": 14, "...
                                End
                                          dead,
                                                                   "na...
                                                                         Jack Spa...
                                           ha...
```

```
In [22]: movies['genres'] = movies['genres'].apply(convert)
```

In [23]: movies.head()

Out[23]:

	movie_id	title	overview	genres	keywords	cast	cr
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_ "52fe48009251416c750aca2 "d
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_ "52fe4232c3a36847f800b57 "d
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_ "54805967c3a36829b5002c4 "d
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_ "52fe4781c3a36847f81398c "d
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_ "52fe479ac3a36847f813eaa "d
4							

In [24]: movies['keywords'][0]

d": 3386, "name": "space war"}, {"id": 3388, "name": "space colony"}, {"id":
3679, "name": "society"}, {"id": 3801, "name": "space travel"}, {"id": 9685,
 "name": "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": 113
99, "name": "marine"}, {"id": 13065, "name": "soldier"}, {"id": 14643, "nam
 e": "battle"}, {"id": 14720, "name": "love affair"}, {"id": 165431, "name":

Out[24]: '[{"id": 1463, "name": "culture clash"}, {"id": 2964, "name": "future"}, {"i

"anti war"}, {"id": 193554, "name": "power relations"}, {"id": 206690, "nam
e": "mind and soul"}, {"id": 209714, "name": "3d"}]'

In [25]: movies['keywords'] = movies['keywords'].apply(convert)

In [26]: movies.head()

Out[26]:

	movie_id	title	overview	genres	keywords	cast	cr
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_ "52fe48009251416c750aca2 "d
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_ "52fe4232c3a36847f800b57 "d
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_ "54805967c3a36829b5002c4 "d
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_ "52fe4781c3a36847f81398c "d
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_ "52fe479ac3a36847f813eaa "d
4							•

In [27]: movies['cast'][0]

Out[27]: '[{"cast_id": 242, "character": "Jake Sully", "credit_id": "5602a8a7c3a36855 32001c9a", "gender": 2, "id": 65731, "name": "Sam Worthington", "order": 0}, {"cast_id": 3, "character": "Neytiri", "credit_id": "52fe48009251416c750ac9c b", "gender": 1, "id": 8691, "name": "Zoe Saldana", "order": 1}, {"cast_id": "character": "Dr. Grace Augustine", "credit_id": "52fe48009251416c750aca 39", "gender": 1, "id": 10205, "name": "Sigourney Weaver", "order": 2}, {"ca st_id": 4, "character": "Col. Quaritch", "credit_id": "52fe48009251416c750ac 9cf", "gender": 2, "id": 32747, "name": "Stephen Lang", "order": 3}, {"cast_ id": 5, "character": "Trudy Chacon", "credit_id": "52fe48009251416c750ac9d
3", "gender": 1, "id": 17647, "name": "Michelle Rodriguez", "order": 4}, {"c ast_id": 8, "character": "Selfridge", "credit_id": "52fe48009251416c750ac9e "gender": 2, "id": 1771, "name": "Giovanni Ribisi", "order": 5}, {"cast_ id": 7, "character": "Norm Spellman", "credit_id": "52fe48009251416c750ac9d d", "gender": 2, "id": 59231, "name": "Joel David Moore", "order": 6}, {"cas t_id": 9, "character": "Moat", "credit_id": "52fe48009251416c750ac9e5", "gen der": 1, "id": 30485, "name": "CCH Pounder", "order": 7}, {"cast_id": 11, "c , "credit_id": "52fe48009251416c750ac9ed", "gender": 2, haracter": "Eytukan", "id": 15853, "name": "Wes Studi", "order": 8}, {"cast_id": 10, "character": "Tsu\'Tey", "credit_id": "52fe48009251416c750ac9e9", "gender": 2, "id": 1096 4, "name": "Laz Alonso", "order": 9}, {"cast_id": 12, "character": "Dr. Max Patel", "credit_id": "52fe48009251416c750ac9f1", "gender": 2, "id": 95697, "name": "Dileep Rao", "order": 10}, {"cast_id": 13, "character": "Lyle Wainf leet", "credit_id": "52fe48009251416c750ac9f5", "gender": 2, "id": 98215, "n ame": "Matt Gerald", "order": 11}, {"cast_id": 32, "character": "Private Fik e", "credit_id": "52fe48009251416c750aca5b", "gender": 2, "id": 154153, "nam e": "Sean Anthony Moran", "order": 12}, {"cast_id": 33, "character": "Cryo V ault Med Tech", "credit_id": "52fe48009251416c750aca5f", "gender": 2, "id": 397312, "name": "Jason Whyte", "order": 13}, {"cast_id": 34, "character": "V enture Star Crew Chief", "credit_id": "52fe48009251416c750aca63", "gender": 2, "id": 42317, "name": "Scott Lawrence", "order": 14}, {"cast_id": 35, "cha racter": "Lock Up Trooper", "credit_id": "52fe48009251416c750aca67", "gende r": 2, "id": 986734, "name": "Kelly Kilgour", "order": 15}, {"cast_id": 36, "character": "Shuttle Pilot", "credit_id": "52fe48009251416c750aca6b", "gend er": 0, "id": 1207227, "name": "James Patrick Pitt", "order": 16}, {"cast_i d": 37, "character": "Shuttle Co-Pilot", "credit_id": "52fe48009251416c750ac a6f", "gender": 0, "id": 1180936, "name": "Sean Patrick Murphy", "order": 1 7}, {"cast_id": 38, "character": "Shuttle Crew Chief", "credit_id": "52fe480 09251416c750aca73", "gender": 2, "id": 1019578, "name": "Peter Dillon", "ord er": 18}, {"cast_id": 39, "character": "Tractor Operator / Troupe", "credit_ id": "52fe48009251416c750aca77", "gender": 0, "id": 91443, "name": "Kevin Do rman", "order": 19}, {"cast_id": 40, "character": "Dragon Gunship Pilot", redit_id": "52fe48009251416c750aca7b", "gender": 2, "id": 173391, "name": "K elson Henderson", "order": 20}, {"cast_id": 41, "character": "Dragon Gunship Gunner", "credit_id": "52fe48009251416c750aca7f", "gender": 0, "id": 120723 6, "name": "David Van Horn", "order": 21}, {"cast_id": 42, "character": "Dra gon Gunship Navigator", "credit_id": "52fe48009251416c750aca83", "gender": 0, "id": 215913, "name": "Jacob Tomuri", "order": 22}, {"cast_id": 43, "char acter": "Suit #1", "credit_id": "52fe48009251416c750aca87", "gender": 0, "i d": 143206, "name": "Michael Blain-Rozgay", "order": 23}, {"cast_id": 44, "c haracter": "Suit #2", "credit_id": "52fe48009251416c750aca8b", "gender": 2, "id": 169676, "name": "Jon Curry", "order": 24}, {"cast_id": 46, "characte r": "Ambient Room Tech", "credit_id": "52fe48009251416c750aca8f", "gender": 0, "id": 1048610, "name": "Luke Hawker", "order": 25}, {"cast_id": 47, "char acter": "Ambient Room Tech / Troupe", "credit_id": "52fe48009251416c750aca9 3", "gender": 0, "id": 42288, "name": "Woody Schultz", "order": 26}, {"cast id": 48, "character": "Horse Clan Leader", "credit_id": "52fe48009251416c750 aca97", "gender": 2, "id": 68278, "name": "Peter Mensah", "order": 27}, {"ca

st_id": 49, "character": "Link Room Tech", "credit_id": "52fe48009251416c750 aca9b", "gender": 0, "id": 1207247, "name": "Sonia Yee", "order": 28}, {"cas t_id": 50, "character": "Basketball Avatar / Troupe", "credit_id": "52fe4800 9251416c750aca9f", "gender": 1, "id": 1207248, "name": "Jahnel Curfman", "or der": 29}, {"cast_id": 51, "character": "Basketball Avatar", "credit_id": "5 2fe48009251416c750acaa3", "gender": 0, "id": 89714, "name": "Ilram Choi", "o rder": 30}, {"cast_id": 52, "character": "Na\'vi Child", "credit_id": "52fe4 8009251416c750acaa7", "gender": 0, "id": 1207249, "name": "Kyla Warren", "or der": 31}, {"cast_id": 53, "character": "Troupe", "credit_id": "52fe48009251 416c750acaab", "gender": 0, "id": 1207250, "name": "Lisa Roumain", "order": 32}, {"cast_id": 54, "character": "Troupe", "credit_id": "52fe48009251416c75 0acaaf", "gender": 1, "id": 83105, "name": "Debra Wilson", "order": 33}, {"c ast_id": 57, "character": "Troupe", "credit_id": "52fe48009251416c750acabb", "gender": 0, "id": 1207253, "name": "Chris Mala", "order": 34}, {"cast_id": 55, "character": "Troupe", "credit_id": "52fe48009251416c750acab3", "gende r": 0, "id": 1207251, "name": "Taylor Kibby", "order": 35}, {"cast_id": 56, "credit_id": "52fe48009251416c750acab7", "gender": 0, "character": "Troupe", "id": 1207252, "name": "Jodie Landau", "order": 36}, {"cast_id": 58, "charac ter": "Troupe", "credit_id": "52fe48009251416c750acabf", "gender": 0, "id": 1207254, "name": "Julie Lamm", "order": 37}, {"cast_id": 59, "character": "T roupe", "credit_id": "52fe48009251416c750acac3", "gender": 0, "id": 1207257, "name": "Cullen B. Madden", "order": 38}, {"cast_id": 60, "character": "Trou pe", "credit_id": "52fe48009251416c750acac7", "gender": 0, "id": 1207259, "n ame": "Joseph Brady Madden", "order": 39}, {"cast_id": 61, "character": "Tro upe", "credit_id": "52fe48009251416c750acacb", "gender": 0, "id": 1207262, "name": "Frankie Torres", "order": 40}, {"cast_id": 62, "character": "Troup e", "credit_id": "52fe48009251416c750acacf", "gender": 1, "id": 1158600, "na me": "Austin Wilson", "order": 41}, {"cast_id": 63, "character": "Troupe", "credit_id": "52fe48019251416c750acad3", "gender": 1, "id": 983705, "name": "Sara Wilson", "order": 42}, {"cast_id": 64, "character": "Troupe", "credit_ id": "52fe48019251416c750acad7", "gender": 0, "id": 1207263, "name": "Tamica Washington-Miller", "order": 43}, {"cast_id": 65, "character": "Op Center St aff", "credit_id": "52fe48019251416c750acadb", "gender": 1, "id": 1145098, "name": "Lucy Briant", "order": 44}, {"cast_id": 66, "character": "Op Center Staff", "credit_id": "52fe48019251416c750acadf", "gender": 2, "id": 33305, "name": "Nathan Meister", "order": 45}, {"cast_id": 67, "character": "Op Cen ter Staff", "credit_id": "52fe48019251416c750acae3", "gender": 0, "id": 1207 264, "name": "Gerry Blair", "order": 46}, {"cast_id": 68, "character": "Op C enter Staff", "credit_id": "52fe48019251416c750acae7", "gender": 2, "id": 33 311, "name": "Matthew Chamberlain", "order": 47}, {"cast_id": 69, "characte r": "Op Center Staff", "credit_id": "52fe48019251416c750acaeb", "gender": 0, r": "Op Center Duty Officer", "credit_id": "52fe48019251416c750acaef", "gend er": 0, "id": 1207266, "name": "Wray Wilson", "order": 49}, {"cast_id": 71, "character": "Op Center Staff", "credit_id": "52fe48019251416c750acaf3", "ge nder": 2, "id": 54492, "name": "James Gaylyn", "order": 50}, {"cast_id": 72, "character": "Dancer", "credit_id": "52fe48019251416c750acaf7", "gender": 0, "id": 1207267, "name": "Melvin Leno Clark III", "order": 51}, {"cast_id": 7 3, "character": "Dancer", "credit_id": "52fe48019251416c750acafb", "gender": 0, "id": 1207268, "name": "Carvon Futrell", "order": 52}, {"cast_id": 74, "c haracter": "Dancer", "credit_id": "52fe48019251416c750acaff", "gender": 0, "id": 1207269, "name": "Brandon Jelkes", "order": 53}, {"cast_id": 75, "char acter": "Dancer", "credit_id": "52fe48019251416c750acb03", "gender": 0, "i d": 1207270, "name": "Micah Moch", "order": 54}, {"cast_id": 76, "characte r": "Dancer", "credit_id": "52fe48019251416c750acb07", "gender": 0, "id": 12 07271, "name": "Hanniyah Muhammad", "order": 55}, {"cast_id": 77, "characte r": "Dancer", "credit_id": "52fe48019251416c750acb0b", "gender": 0, "id": 12

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```
In [28]: def convert3(text):
    L = []
    counter = 0
    for i in ast.literal_eval(text):
        if counter <3:
            L.append(i['name'])
        counter +=1
    return L</pre>
```

```
In [29]: movies['cast'] = movies['cast'].apply(convert3)
```

In [30]: movies.head()

Out[30]:

	cast	keywords	genres	overview	title	movie_id	
[{"credi "52fe48009251416c750aca	[Sam Worthington, Zoe Saldana, Sigourney Weaver]	[culture clash, future, space war, space colon	[Action, Adventure, Fantasy, Science Fiction]	In the 22nd century, a paraplegic Marine is di	Avatar	19995	0
[{"credi "52fe4232c3a36847f800b	[Johnny Depp, Orlando Bloom, Keira Knightley]	[ocean, drug abuse, exotic island, east india 	[Adventure, Fantasy, Action]	Captain Barbossa, long believed to be dead, ha	Pirates of the Caribbean: At World's End	285	1
[{"credi "54805967c3a36829b5002	[Daniel Craig, Christoph Waltz, Léa Seydoux]	[spy, based on novel, secret agent, sequel, mi	[Action, Adventure, Crime]	A cryptic message from Bond's past sends him o	Spectre	206647	2
[{"credi "52fe4781c3a36847f8139 '	[Christian Bale, Michael Caine, Gary Oldman]	[dc comics, crime fighter, terrorist, secret i	[Action, Crime, Drama, Thriller]	Following the death of District Attorney Harve	The Dark Knight Rises	49026	3
[{"credi "52fe479ac3a36847f813e	[Taylor Kitsch, Lynn Collins, Samantha Morton]	[based on novel, mars, medallion, space travel	[Action, Adventure, Science Fiction]	John Carter is a war- weary, former military ca	John Carter	49529	4
•							4

```
In [31]: movies['crew'][0]
Out[31]: '[{"credit_id": "52fe48009251416c750aca23", "department": "Editing", "gen
          der": 0, "id": 1721, "job": "Editor", "name": "Stephen E. Rivkin"}, {"cre
dit_id": "539c47ecc3a36810e3001f87", "department": "Art", "gender": 2, "i
           d": 496, "job": "Production Design", "name": "Rick Carter"}, {"credit_i
           d": "54491c89c3a3680fb4001cf7", "department": "Sound", "gender": 0, "id":
          900, "job": "Sound Designer", "name": "Christopher Boyes"}, {"credit_id":
           "54491cb70e0a267480001bd0", "department": "Sound", "gender": 0, "id": 90
          0, "job": "Supervising Sound Editor", "name": "Christopher Boyes"}, {"credit_id": "539c4a4cc3a36810c9002101", "department": "Production", "gender": 1, "id": 1262, "job": "Casting", "name": "Mali Finn"}, {"credit_id":
           "5544ee3b925141499f0008fc", "department": "Sound", "gender": 2, "id": 172
           9, "job": "Original Music Composer", "name": "James Horner"}, {"credit_i
           d": "52fe48009251416c750ac9c3", "department": "Directing", "gender": 2,
           "id": 2710, "job": "Director", "name": "James Cameron"}, {"credit_id": "5
           2fe48009251416c750ac9d9", "department": "Writing", "gender": 2, "id": 271
           0, "job": "Writer", "name": "James Cameron"}, {"credit_id": "52fe48009251
           416c750aca17", "department": "Editing", "gender": 2, "id": 2710, "job":
           "Editor", "name": "James Cameron"}, {"credit_id": "52fe48009251416c750aca
           29", "department": "Production", "gender": 2, "id": 2710, "job": "Produce
In [32]: def fetch_director(text):
               L = []
               for i in ast.literal_eval(text):
                    if i['job']=='Director':
                        L.append(i['name'])
               return L
```

In [33]: |movies['crew'] = movies['crew'].apply(fetch_director)

```
In [34]: movies.head()
```

Out[34]:

	ı	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 [35]:	def	collaps L1 = [] for i i L1. return	n L: append(i.re	place(" ","	"))			
In [36]:	movi	ies.colu	mns					
Out[36]:		. –	rie_id', 'ti :'object')	tle', 'over	view', 'ge	nres', 'key	words', 'cas	t', 'cre
In [37]:	movi movi	ies['key ies['cas	words'] = m t'] = movie	ies['genres ovies['keyw s['cast'].a s['crew'].a	ords'].app pply(colla	ly(collapse pse))	

In [38]: movies.head()

Out[38]:

	movie_id	title	overview	genres	keywords	cast	
0	19995	Avatar	In the 22nd century, a paraplegic Marine is di	[Action, Adventure, Fantasy, ScienceFiction]	[cultureclash, future, spacewar, spacecolony, 	[SamWorthington, ZoeSaldana, SigourneyWeaver]	[JamesCam
1	285	Pirates of the Caribbean: At World's End	Captain Barbossa, long believed to be dead, ha	[Adventure, Fantasy, Action]	[ocean, drugabuse, exoticisland, eastindiatrad	[JohnnyDepp, OrlandoBloom, KeiraKnightley]	[GoreVerb
2	206647	Spectre	A cryptic message from Bond's past sends him o	[Action, Adventure, Crime]	[spy, basedonnovel, secretagent, sequel, mi6,	[DanielCraig, ChristophWaltz, LéaSeydoux]	[SamMe
3	49026	The Dark Knight Rises	Following the death of District Attorney Harve	[Action, Crime, Drama, Thriller]	[dccomics, crimefighter, terrorist, secretiden	[ChristianBale, MichaelCaine, GaryOldman]	[ChristopherN
4	49529	John Carter	John Carter is a war- weary, former military ca	[Action, Adventure, ScienceFiction]	[basedonnovel, mars, medallion, spacetravel, p	[TaylorKitsch, LynnCollins, SamanthaMorton]	[AndrewSta
4							•

```
In [39]:
        print(movies['overview'][0])
        print("*******10)
        print(movies['genres'][0])
        print("*******10)
        print(movies['keywords'][0])
        print("*******10)
        print(movies['cast'][0])
        print("********10)
        print(movies['crew'][0])
        print("*******10)
        In the 22nd century, a paraplegic Marine is dispatched to the moon Pandora o
        n a unique mission, but becomes torn between following orders and protecting
        an alien civilization.
        *********************************
        ['Action', 'Adventure', 'Fantasy', 'ScienceFiction']
        ['cultureclash', 'future', 'spacewar', 'spacecolony', 'society', 'spacetrave
        l', 'futuristic', 'romance', 'space', 'alien', 'tribe', 'alienplanet', 'cg
        i', 'marine', 'soldier', 'battle', 'loveaffair', 'antiwar', 'powerrelation
           'mindandsoul', '3d']
        ****************************
        ['SamWorthington', 'ZoeSaldana', 'SigourneyWeaver']
        ****
        ['JamesCameron']
        ****
In [40]:
        # split sentence into words
        movies['overview'] = movies['overview'].apply(lambda x: x.split())
In [41]: |print(movies['overview'][0])
        ['In', 'the', '22nd', 'century,', 'a', 'paraplegic', 'Marine', 'is', 'dispat ched', 'to', 'the', 'moon', 'Pandora', 'on', 'a', 'unique', 'mission,', 'bu
        t', 'becomes', 'torn', 'between', 'following', 'orders', 'and', 'protectin
```

g', 'an', 'alien', 'civilization.']

```
print(movies['overview'][0])
In [42]:
       print("*******10)
        print(movies['genres'][0])
        print("*******10)
        print(movies['keywords'][0])
        print("*******10)
        print(movies['cast'][0])
        print("********10)
        print(movies['crew'][0])
        print("*******10)
        ['In', 'the', '22nd', 'century,', 'a', 'paraplegic', 'Marine', 'is', 'dispat
        ched', 'to', 'the', 'moon', 'Pandora', 'on', 'a', 'unique', 'mission,', 'bu
        t', 'becomes', 'torn', 'between', 'following', 'orders', 'and', 'protectin
        g', 'an', 'alien', 'civilization.']
        *********************************
        ['Action', 'Adventure', 'Fantasy', 'ScienceFiction']
        *********************************
        ['cultureclash', 'future', 'spacewar', 'spacecolony', 'society', 'spacetrave
        l', 'futuristic', 'romance', 'space', 'alien', 'tribe', 'alienplanet', 'cg
           'marine', 'soldier', 'battle', 'loveaffair', 'antiwar', 'powerrelation
        s', 'mindandsoul', '3d']
        ******************************
        ['SamWorthington', 'ZoeSaldana', 'SigourneyWeaver']
        **************
        ['JamesCameron']
        ******************************
In [43]: # make one columns basis overview, genres, keywords, cast and crew
       movies['tags'] = movies['overview'] + movies['genres'] + movies['keywords'] +
```

In [44]: movies.head()

Out[44]:

	cast	keywords	genres	overview	title	movie_id	
[JamesCan	[SamWorthington, ZoeSaldana, SigourneyWeaver]	[cultureclash, future, spacewar, spacecolony, 	[Action, Adventure, Fantasy, ScienceFiction]	[In, the, 22nd, century,, a, paraplegic, Marin	Avatar	19995	0
[GoreVerl	[JohnnyDepp, OrlandoBloom, KeiraKnightley]	[ocean, drugabuse, exoticisland, eastindiatrad	[Adventure, Fantasy, Action]	[Captain, Barbossa,, long, believed, to, be, d	Pirates of the Caribbean: At World's End	285	1
[SamMe	[DanielCraig, ChristophWaltz, LéaSeydoux]	[spy, basedonnovel, secretagent, sequel, mi6,	[Action, Adventure, Crime]	[A, cryptic, message, from, Bond's, past, send	Spectre	206647	2
[Christopher]	[ChristianBale, MichaelCaine, GaryOldman]	[dccomics, crimefighter, terrorist, secretiden	[Action, Crime, Drama, Thriller]	[Following, the, death, of, District, Attorney	The Dark Knight Rises	49026	3
[AndrewSt	[TaylorKitsch, LynnCollins, SamanthaMorton]	[basedonnovel, mars, medallion, spacetravel, p	[Action, Adventure, ScienceFiction]	[John, Carter, is, a, war- weary,, former, mili	John Carter	49529	4
•							4

In [45]: new = movies.drop(columns=['overview', 'genres', 'keywords', 'cast', 'crew'])

In [46]: new.head()

Out[46]:

	movie_id	title	tags
0	19995	Avatar	[In, the, 22nd, century,, a, paraplegic, Marin
1	285	Pirates of the Caribbean: At World's End	[Captain, Barbossa,, long, believed, to, be, d
2	206647	Spectre	[A, cryptic, message, from, Bond's, past, send
3	49026	The Dark Knight Rises	[Following, the, death, of, District, Attorney
4	49529	John Carter	[John, Carter, is, a, war-weary,, former, mili

In [47]: new['tags'] = new['tags'].apply(lambda x: " ".join(x))

In [48]: new.head()

Out[48]:

tags	title	movie_id	
In the 22nd century, a paraplegic Marine is di	Avatar	19995	0
Captain Barbossa, long believed to be dead, ha	Pirates of the Caribbean: At World's End	285	1
A cryptic message from Bond's past sends him o	Spectre	206647	2
Following the death of District Attorney Harve	The Dark Knight Rises	49026	3
John Carter is a war-weary, former military ca	John Carter	49529	4

```
In [49]: new['tags'][0]
```

Out[49]: 'In the 22nd century, a paraplegic Marine is dispatched to the moon Pandora on a unique mission, but becomes torn between following orders and protectin g an alien civilization. Action Adventure Fantasy ScienceFiction cultureclas h future spacewar spacecolony society spacetravel futuristic romance space a lien tribe alienplanet cgi marine soldier battle loveaffair antiwar powerrel ations mindandsoul 3d SamWorthington ZoeSaldana SigourneyWeaver JamesCamero n'

Bag of words (BOW) - Feature extraction/engineering method

```
In [50]: from sklearn.feature_extraction.text import CountVectorizer
# apply stopwords and also give hard coded feature value - 5000
cv = CountVectorizer(stop_words='english', max_features=5000)
vector = cv.fit_transform(new['tags']).toarray()
vector.shape
```

Out[50]: (4806, 5000)

To use Similarity matrix for building recommendation system

```
In [51]: from sklearn.metrics.pairwise import cosine_similarity
```

```
In [52]: | similarity = cosine_similarity(vector)
```

```
similarity
In [53]:
Out[53]: array([[1.
                                  , 0.08964215, 0.06071767, ..., 0.02519763, 0.0277885 ,
                    [0.08964215, 1.
                                                 , 0.06350006, ..., 0.02635231, 0.
                                                                , ..., 0.02677398, 0.
                    [0.06071767, 0.06350006, 1.
                     0.
                                  ],
                    [0.02519763, 0.02635231, 0.02677398, ..., 1.
                                                                                     , 0.07352146,
                     0.04774099],
                    [0.0277885, 0.
                                                                , ..., 0.07352146, 1.
                     0.05264981],
                                                                , ..., 0.04774099, 0.05264981,
                    [0.
                     1.
                                  ]])
In [54]:
           #near by 1 is similar movie
In [55]:
           new.tail(10)
Out[55]:
                                                    title
                   movie_id
                                                                                                   tags
            4799
                     182291
                                         On The Downlow
                                                            Isaac and Angel are two young Latinos involved...
            4800
                    286939
                             Sanctuary: Quite a Conundrum
                                                              It should have been just a normal day of sex, ...
            4801
                     124606
                                                            A young woman in L.A. is having a bad day: she...
                                                   Bang
            4802
                      14337
                                                  Primer
                                                              Friends/fledgling entrepreneurs invent a devic...
            4803
                      67238
                                                  Cavite
                                                              Adam, a security guard, travels from Californi...
            4804
                       9367
                                              El Mariachi
                                                               El Mariachi just wants to play his guitar and ...
                      72766
            4805
                                              Newlyweds
                                                         A newlywed couple's honeymoon is upended by th...
            4806
                    231617
                                 Signed, Sealed, Delivered
                                                             "Signed, Sealed, Delivered" introduces a dedic...
            4807
                     126186
                                         Shanghai Calling
                                                           When ambitious New York attorney Sam is sent t...
            4808
                      25975
                                       My Date with Drew
                                                            Ever since the second grade when he first saw ...
           new[new['title']=='Bang'].index[0]
```

Out[56]: 4801

Recommendation System

```
In [57]: def recommend(movie):
             index = new[new['title']==movie].index[0]
             distances = sorted(list(enumerate(similarity[index])), reverse=True, key
             for i in distances[1:6]:
                 print(new.iloc[i[0]].title)
In [58]: recommend('Spider-Man 3')
         Spider-Man 2
         Spider-Man
         The Amazing Spider-Man 2
         The Amazing Spider-Man
         Arachnophobia
In [60]: recommend('Harry Potter and the Chamber of Secrets')
         Harry Potter and the Prisoner of Azkaban
         Harry Potter and the Order of the Phoenix
         Harry Potter and the Goblet of Fire
         Harry Potter and the Philosopher's Stone
         Harry Potter and the Half-Blood Prince
In [61]: recommend('The Dark Knight Rises')
         The Dark Knight
         Batman Begins
         Batman
         Batman Returns
         Batman
In [62]: recommend('Avengers: Age of Ultron')
         Iron Man
         Iron Man 3
         The Avengers
         Captain America: Civil War
         Iron Man 2
In [64]: recommend('Primer')
         Purple Violets
         She's the One
         My Big Fat Greek Wedding 2
         Lovely & Amazing
         I Don't Know How She Does It
In [ ]:
```

Deployment

```
import pickle
In [65]:
In [68]: !pip install streamlit
         Collecting streamlit
         WARNING: Ignoring invalid distribution -ordcloud (c:\users\abc\anaconda3
         \lib\site-packages)
         WARNING: Ignoring invalid distribution -ordcloud (c:\users\abc\anaconda3
         \lib\site-packages)
         WARNING: Ignoring invalid distribution -ordcloud (c:\users\abc\anaconda3
         \lib\site-packages)
             WARNING: Ignoring invalid distribution -ordcloud (c:\users\abc\anacon
         da3\lib\site-packages)
             WARNING: Ignoring invalid distribution -ordcloud (c:\users\abc\anacon
         da3\lib\site-packages)
             WARNING: Ignoring invalid distribution -ordcloud (c:\users\abc\anacon
         da3\lib\site-packages)
             WARNING: Ignoring invalid distribution -ordcloud (c:\users\abc\anacon
         da3\lib\site-packages)
         WARNING: Ignoring invalid distribution -ordcloud (c:\users\abc\anaconda3
         \lib\site-packages)
         WARNING: Ignoring invalid distribution -ordcloud (c:\users\abc\anaconda3
         \lih\cito_nackagoc\
         pickle.dump(new.to_dict(), open('movie_dict.pkl', 'wb'))
In [66]:
         pickle.dump(similarity, open('similarity.pkl', 'wb'))
```

```
import pickle
In [ ]:
        import streamlit as st
        import pandas as pd
        def recommend(movie):
            movie_index = movies[movies['title']==movie].index[0]
            distances = similarity[movie_index]
            movies_list = sorted(list(enumerate(distances)), reverse=True, key= lambd
            recommended_movies = []
            for i in movies list:
                recommended_movies.append(movies.iloc[i[0]].title)
            return recommended_movies
        movies_dict = pickle.load(open('movie_dict.pkl', 'rb'))
        movies = pd.DataFrame(movies_dict)
        similarity = pickle.load(open('similarity.pkl', 'rb'))
        st.title("Movie Recommender System-Raghav")
        selected_movie_name = st.selectbox(
            'How would you like to be contacted?',
            movies['title'].values)
        if st.button('Recommend'):
            recommendations = recommend(selected_movie_name)
        for i in recommendations:
            st.write(i)
In [ ]:
In [ ]:
In [ ]:
In [ ]:
```