Movie Recommender System

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1 Movie Recommender System

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2 Datasets

```
[3]: movies.head()
[3]:
           budget
                                                               genres
        237000000
                   [{"id": 28, "name": "Action"}, {"id": 12, "nam...
     1 300000000 [{"id": 12, "name": "Adventure"}, {"id": 14, "...
     2 245000000 [{"id": 28, "name": "Action"}, {"id": 12, "nam...
     3 250000000
                  [{"id": 28, "name": "Action"}, {"id": 80, "nam...
     4 260000000
                  [{"id": 28, "name": "Action"}, {"id": 12, "nam...
                                             homepage
                                                           id
     0
                         http://www.avatarmovie.com/
                                                        19995
     1
       http://disney.go.com/disneypictures/pirates/
                                                          285
        http://www.sonypictures.com/movies/spectre/
     2
                                                       206647
     3
                  http://www.thedarkknightrises.com/
                                                        49026
     4
                http://movies.disney.com/john-carter
                                                        49529
                                                  keywords original language \
       [{"id": 1463, "name": "culture clash"}, {"id":...
     1 [{"id": 270, "name": "ocean"}, {"id": 726, "na...
                                                                         en
     2 [{"id": 470, "name": "spy"}, {"id": 818, "name...
                                                                         en
     3 [{"id": 849, "name": "dc comics"}, {"id": 853,...
                                                                         en
     4 [{"id": 818, "name": "based on novel"}, {"id":...
                                                                         en
```

original_title \

```
0
                                      Avatar
  Pirates of the Caribbean: At World's End
1
2
                                     Spectre
3
                      The Dark Knight Rises
4
                                 John Carter
                                             overview popularity \
   In the 22nd century, a paraplegic Marine is di...
                                                     150.437577
   Captain Barbossa, long believed to be dead, ha...
                                                     139.082615
2 A cryptic message from Bond's past sends him o...
                                                     107.376788
3 Following the death of District Attorney Harve...
                                                     112.312950
4 John Carter is a war-weary, former military ca...
                                                      43.926995
                                 production_companies \
 [{"name": "Ingenious Film Partners", "id": 289...
1 [{"name": "Walt Disney Pictures", "id": 2}, {"...
2 [{"name": "Columbia Pictures", "id": 5}, {"nam...
3 [{"name": "Legendary Pictures", "id": 923}, {"...
         [{"name": "Walt Disney Pictures", "id": 2}]
                                 production_countries release_date
                                                                        revenue \
 [{"iso_3166_1": "US", "name": "United States o...
                                                      2009-12-10 2787965087
1 [{"iso_3166_1": "US", "name": "United States o...
                                                                    961000000
                                                      2007-05-19
2 [{"iso 3166 1": "GB", "name": "United Kingdom"...
                                                      2015-10-26
                                                                    880674609
3 [{"iso_3166_1": "US", "name": "United States o...
                                                      2012-07-16 1084939099
4 [{"iso_3166_1": "US", "name": "United States o...
                                                      2012-03-07
                                                                    284139100
   runtime
                                              spoken_languages
                                                                   status \
0
     162.0
            [{"iso_639_1": "en", "name": "English"}, {"iso... Released
                      [{"iso_639_1": "en", "name": "English"}]
1
     169.0
2
     148.0
            [{"iso_639_1": "fr", "name": "Fran\u00e7ais"},... Released
                      [{"iso_639_1": "en", "name": "English"}]
3
     165.0
4
     132.0
                      [{"iso_639_1": "en", "name": "English"}]
                                           tagline \
0
                      Enter the World of Pandora.
1
  At the end of the world, the adventure begins.
2
                            A Plan No One Escapes
3
                                   The Legend Ends
             Lost in our world, found in another.
4
                                       title
                                             vote_average
                                                            vote_count
0
                                      Avatar
                                                       7.2
                                                                  11800
  Pirates of the Caribbean: At World's End
                                                       6.9
                                                                   4500
1
2
                                     Spectre
                                                       6.3
                                                                   4466
3
                      The Dark Knight Rises
                                                       7.6
                                                                   9106
4
                                 John Carter
                                                       6.1
                                                                   2124
```

```
[4]: credits.head()
[4]:
                                                      title \
        movie_id
     0
           19995
                                                     Avatar
     1
             285
                 Pirates of the Caribbean: At World's End
     2
          206647
                                                    Spectre
     3
           49026
                                     The Dark Knight Rises
                                                John Carter
     4
           49529
                                                      cast
     0 [{"cast_id": 242, "character": "Jake Sully", "...
     1 [{"cast_id": 4, "character": "Captain Jack Spa...
     2 [{"cast_id": 1, "character": "James Bond", "cr...
     3 [{"cast_id": 2, "character": "Bruce Wayne / Ba...
     4 [{"cast_id": 5, "character": "John Carter", "c...
                                                      crew
     0 [{"credit_id": "52fe48009251416c750aca23", "de...
     1 [{"credit_id": "52fe4232c3a36847f800b579", "de...
     2 [{"credit_id": "54805967c3a36829b5002c41", "de...
     3 [{"credit_id": "52fe4781c3a36847f81398c3", "de...
     4 [{"credit_id": "52fe479ac3a36847f813eaa3", "de...
      Data Preprocessing
[5]: movies.shape
[5]: (4803, 20)
[6]: credits.shape
[6]: (4803, 4)
[7]: movies=movies.merge(credits,on="title")
     movies.head(2)
[7]:
           budget
                                                               genres \
     0 237000000
                  [{"id": 28, "name": "Action"}, {"id": 12, "nam...
     1 300000000 [{"id": 12, "name": "Adventure"}, {"id": 14, "...
                                             homepage
                                                          id \
                         http://www.avatarmovie.com/
     0
                                                       19995
     1 http://disney.go.com/disneypictures/pirates/
                                                         285
                                                  keywords original_language \
     0 [{"id": 1463, "name": "culture clash"}, {"id":...
                                                                        en
     1 [{"id": 270, "name": "ocean"}, {"id": 726, "na...
                                                                        en
```

```
Avatar
     1 Pirates of the Caribbean: At World's End
                                                  overview popularity \
    O In the 22nd century, a paraplegic Marine is di... 150.437577
     1 Captain Barbossa, long believed to be dead, ha... 139.082615
                                     production_companies ... runtime \
     0 [{"name": "Ingenious Film Partners", "id": 289... ...
     1 [{"name": "Walt Disney Pictures", "id": 2}, {"... ...
                                          spoken_languages
                                                              status \
     0 [{"iso_639_1": "en", "name": "English"}, {"iso... Released
                 [{"iso_639_1": "en", "name": "English"}] Released
                                                tagline \
     0
                           Enter the World of Pandora.
     1 At the end of the world, the adventure begins.
                                           title vote_average vote_count movie_id \
     0
                                                           7.2
                                                                    11800
                                                                             19995
                                          Avatar
     1 Pirates of the Caribbean: At World's End
                                                           6.9
                                                                     4500
                                                                               285
    0 [{"cast_id": 242, "character": "Jake Sully", "...
     1 [{"cast id": 4, "character": "Captain Jack Spa...
                                                      crew
     0 [{"credit_id": "52fe48009251416c750aca23", "de...
     1 [{"credit_id": "52fe4232c3a36847f800b579", "de...
     [2 rows x 23 columns]
[8]: movies=movies[["genres", "movie_id", "keywords", "overview", "title", "cast", "crew"]]
[9]: movies.head(2)
[9]:
                                                    genres movie id \
     0 [{"id": 28, "name": "Action"}, {"id": 12, "nam...
                                                             19995
     1 [{"id": 12, "name": "Adventure"}, {"id": 14, "...
                                                               285
                                                 keywords \
    0 [{"id": 1463, "name": "culture clash"}, {"id":...
     1 [{"id": 270, "name": "ocean"}, {"id": 726, "na...
```

original_title \

```
overview \
      O In the 22nd century, a paraplegic Marine is di...
      1 Captain Barbossa, long believed to be dead, ha...
                                             title \
      0
                                            Avatar
      1 Pirates of the Caribbean: At World's End
                                                       cast \
      0 [{"cast_id": 242, "character": "Jake Sully", "...
      1 [{"cast_id": 4, "character": "Captain Jack Spa...
                                                       crew
      0 [{"credit_id": "52fe48009251416c750aca23", "de...
      1 [{"credit_id": "52fe4232c3a36847f800b579", "de...
[10]: movies.isna().sum()
[10]: genres
     movie_id
                  0
     keywords
                  0
      overview
                  3
      title
                  0
      cast
                  0
      crew
                  0
      dtype: int64
[11]: movies.dropna(inplace=True)
[12]: movies.isna().sum()
[12]: genres
                  0
     movie_id
     keywords
      overview
      title
                  0
      cast
                  0
                  0
      crew
      dtype: int64
[13]: movies.duplicated().sum()
[13]: 0
[14]: movies.iloc[0].genres
[14]: '[{"id": 28, "name": "Action"}, {"id": 12, "name": "Adventure"}, {"id": 14,
      "name": "Fantasy"}, {"id": 878, "name": "Science Fiction"}]'
```

```
[15]: #since list indices must be string literals we use ast
      import ast
      def convert(obj):
          1=[]
          for i in ast.literal_eval(obj):
              1.append(i["name"])
          return 1
[16]: movies["genres"]=movies["genres"].apply(convert)
[17]: movies["keywords"]=movies["keywords"].apply(convert)
[18]: movies.head()
「18]:
                                                 genres
                                                        movie_id \
         [Action, Adventure, Fantasy, Science Fiction]
                                                            19995
                          [Adventure, Fantasy, Action]
                                                              285
      1
      2
                            [Action, Adventure, Crime]
                                                           206647
      3
                      [Action, Crime, Drama, Thriller]
                                                            49026
                  [Action, Adventure, Science Fiction]
                                                            49529
                                                   keywords \
      0 [culture clash, future, space war, space colon...
      1 [ocean, drug abuse, exotic island, east india ...
      2 [spy, based on novel, secret agent, sequel, mi...
      3 [dc comics, crime fighter, terrorist, secret i...
      4 [based on novel, mars, medallion, space travel...
                                                   overview \
      O In the 22nd century, a paraplegic Marine is di...
      1 Captain Barbossa, long believed to be dead, ha...
      2 A cryptic message from Bond's past sends him o...
      3 Following the death of District Attorney Harve...
      4 John Carter is a war-weary, former military ca...
                                             title \
                                            Avatar
      1 Pirates of the Caribbean: At World's End
      2
                                           Spectre
      3
                            The Dark Knight Rises
      4
                                       John Carter
                                                       cast \
      0 [{"cast_id": 242, "character": "Jake Sully", "...
      1 [{"cast_id": 4, "character": "Captain Jack Spa...
      2 [{"cast_id": 1, "character": "James Bond", "cr...
      3 [{"cast_id": 2, "character": "Bruce Wayne / Ba...
```

```
4 [{"cast_id": 5, "character": "John Carter", "c...
                                                        crew
      0 [{"credit_id": "52fe48009251416c750aca23", "de...
      1 [{"credit_id": "52fe4232c3a36847f800b579", "de...
      2 [{"credit_id": "54805967c3a36829b5002c41", "de...
      3 [{"credit_id": "52fe4781c3a36847f81398c3", "de...
      4 [{"credit_id": "52fe479ac3a36847f813eaa3", "de...
[19]: #we need for cast only top 3 casts
      def convertfor3(obj):
          1=[]
          counter=0;
          for i in ast.literal_eval(obj):
              if counter<3:</pre>
                   1.append(i["name"])
                   counter=counter +1;
              else:
                   break;
          return 1
[20]: movies["cast"]=movies["cast"].apply(convertfor3)
[21]:
     movies
[21]:
                                                             movie_id \
                                                     genres
            [Action, Adventure, Fantasy, Science Fiction]
                                                                 19995
      0
      1
                              [Adventure, Fantasy, Action]
                                                                   285
      2
                                [Action, Adventure, Crime]
                                                                206647
                          [Action, Crime, Drama, Thriller]
      3
                                                                 49026
      4
                      [Action, Adventure, Science Fiction]
                                                                 49529
      4804
                                 [Action, Crime, Thriller]
                                                                  9367
                                          [Comedy, Romance]
      4805
                                                                 72766
      4806
                        [Comedy, Drama, Romance, TV Movie]
                                                                231617
      4807
                                                                126186
                                                          4808
                                              [Documentary]
                                                                 25975
                                                       keywords \
      0
            [culture clash, future, space war, space colon...
      1
            [ocean, drug abuse, exotic island, east india ...
      2
            [spy, based on novel, secret agent, sequel, mi...
      3
            [dc comics, crime fighter, terrorist, secret i...
      4
            [based on novel, mars, medallion, space travel...
      4804
            [united states-mexico barrier, legs, arms, pap...
      4805
```

```
4806
      [date, love at first sight, narration, investi...
4807
4808
               [obsession, camcorder, crush, dream girl]
                                                 overview
0
      In the 22nd century, a paraplegic Marine is di...
1
      Captain Barbossa, long believed to be dead, ha...
2
      A cryptic message from Bond's past sends him o...
3
      Following the death of District Attorney Harve...
      John Carter is a war-weary, former military ca...
4
      El Mariachi just wants to play his guitar and ...
4804
4805
      A newlywed couple's honeymoon is upended by th...
4806
      "Signed, Sealed, Delivered" introduces a dedic...
4807
      When ambitious New York attorney Sam is sent t...
4808 Ever since the second grade when he first saw ...
                                           title
0
                                          Avatar
1
      Pirates of the Caribbean: At World's End
2
                                         Spectre
3
                          The Dark Knight Rises
4
                                     John Carter
4804
                                     El Mariachi
4805
                                      Newlyweds
4806
                      Signed, Sealed, Delivered
4807
                               Shanghai Calling
4808
                              My Date with Drew
                                                     cast \
0
       [Sam Worthington, Zoe Saldana, Sigourney Weaver]
1
          [Johnny Depp, Orlando Bloom, Keira Knightley]
           [Daniel Craig, Christoph Waltz, Léa Seydoux]
3
           [Christian Bale, Michael Caine, Gary Oldman]
4
         [Taylor Kitsch, Lynn Collins, Samantha Morton]
4804
      [Carlos Gallardo, Jaime de Hoyos, Peter Marqua...
4805
           [Edward Burns, Kerry Bishé, Marsha Dietlein]
4806
             [Eric Mabius, Kristin Booth, Crystal Lowe]
4807
               [Daniel Henney, Eliza Coupe, Bill Paxton]
4808
      [Drew Barrymore, Brian Herzlinger, Corey Feldman]
                                                     crew
0
      [{"credit_id": "52fe48009251416c750aca23", "de...
1
      [{"credit_id": "52fe4232c3a36847f800b579", "de...
2
      [{"credit_id": "54805967c3a36829b5002c41", "de...
```

```
[{"credit_id": "52fe4781c3a36847f81398c3", "de...
      4
            [{"credit_id": "52fe479ac3a36847f813eaa3", "de...
            [{"credit_id": "52fe44eec3a36847f80b280b", "de...
      4804
      4805 [{"credit_id": "52fe487dc3a368484e0fb013", "de...
      4806 [{"credit_id": "52fe4df3c3a36847f8275ecf", "de...
      4807
            [{"credit_id": "52fe4ad9c3a368484e16a36b", "de...
      4808
            [{"credit_id": "58ce021b9251415a390165d9", "de...
      [4806 rows x 7 columns]
[23]: #we need only director name from crew
      def getdirector(obj):
          1=[];
          for i in ast.literal_eval(obj):
              if(i['job']=='Director'):
                  1.append(i["name"])
          return 1
[24]: movies["crew"]=movies["crew"].apply(getdirector)
[26]: movies.head()
[26]:
                                                 genres
                                                        movie_id \
        [Action, Adventure, Fantasy, Science Fiction]
                                                            19995
      1
                          [Adventure, Fantasy, Action]
                                                              285
      2
                             [Action, Adventure, Crime]
                                                           206647
      3
                      [Action, Crime, Drama, Thriller]
                                                            49026
                  [Action, Adventure, Science Fiction]
                                                            49529
                                                   keywords \
      0 [culture clash, future, space war, space colon...
      1 [ocean, drug abuse, exotic island, east india ...
      2 [spy, based on novel, secret agent, sequel, mi...
      3 [dc comics, crime fighter, terrorist, secret i...
      4 [based on novel, mars, medallion, space travel...
                                                   overview \
      O In the 22nd century, a paraplegic Marine is di...
      1 Captain Barbossa, long believed to be dead, ha...
      2 A cryptic message from Bond's past sends him o...
      3 Following the death of District Attorney Harve...
      4 John Carter is a war-weary, former military ca...
                                             title \
                                            Avatar
      1 Pirates of the Caribbean: At World's End
```

3

```
2
                                            Spectre
      3
                             The Dark Knight Rises
      4
                                       John Carter
                                                       cast
                                                                             crew
         [Sam Worthington, Zoe Saldana, Sigourney Weaver]
                                                                  [James Cameron]
      0
            [Johnny Depp, Orlando Bloom, Keira Knightley]
                                                                 [Gore Verbinski]
      1
      2
             [Daniel Craig, Christoph Waltz, Léa Seydoux]
                                                                     [Sam Mendes]
      3
             [Christian Bale, Michael Caine, Gary Oldman]
                                                              [Christopher Nolan]
      4
           [Taylor Kitsch, Lynn Collins, Samantha Morton]
                                                                 [Andrew Stanton]
[27]: #overview column splitting to list of words
      movies["overview"] = movies["overview"].apply(lambda x:x.split())
[29]: movies.head()
[29]:
                                                  genres
                                                          movie_id
         [Action, Adventure, Fantasy, Science Fiction]
                                                             19995
                           [Adventure, Fantasy, Action]
      1
                                                                285
      2
                             [Action, Adventure, Crime]
                                                            206647
      3
                       [Action, Crime, Drama, Thriller]
                                                             49026
                   [Action, Adventure, Science Fiction]
                                                             49529
                                                    keywords
         [culture clash, future, space war, space colon...
        [ocean, drug abuse, exotic island, east india ...
      2 [spy, based on novel, secret agent, sequel, mi...
      3 [dc comics, crime fighter, terrorist, secret i...
      4 [based on novel, mars, medallion, space travel...
                                                    overview
        [In, the, 22nd, century,, a, paraplegic, Marin...
      1 [Captain, Barbossa,, long, believed, to, be, d...
      2 [A, cryptic, message, from, Bond's, past, send...
      3 [Following, the, death, of, District, Attorney...
         [John, Carter, is, a, war-weary,, former, mili...
                                              title
      0
                                             Avatar
        Pirates of the Caribbean: At World's End
      2
      3
                             The Dark Knight Rises
      4
                                       John Carter
                                                       cast
                                                                             crew
      0
         [Sam Worthington, Zoe Saldana, Sigourney Weaver]
                                                                  [James Cameron]
      1
            [Johnny Depp, Orlando Bloom, Keira Knightley]
                                                                 [Gore Verbinski]
```

```
[Daniel Craig, Christoph Waltz, Léa Seydoux]
                                                                    [Sam Mendes]
      3
             [Christian Bale, Michael Caine, Gary Oldman]
                                                             [Christopher Nolan]
      4
           [Taylor Kitsch, Lynn Collins, Samantha Morton]
                                                                [Andrew Stanton]
[30]: #since we are doing this for tags a space would make it difficult so removing
      movies["genres"]=movies["genres"].apply(lambda x :[i.replace(" ","") for i in__
      movies["keywords"]=movies["keywords"].apply(lambda x :[i.replace(" ","") for i⊔
      movies["overview"]=movies["overview"].apply(lambda x :[i.replace(" ","") for i⊔
       \hookrightarrowin 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])
[31]: movies.head()
[31]:
                                                genres
                                                        movie_id \
         [Action, Adventure, Fantasy, ScienceFiction]
                                                            19995
                          [Adventure, Fantasy, Action]
      1
                                                              285
      2
                            [Action, Adventure, Crime]
                                                           206647
                      [Action, Crime, Drama, Thriller]
      3
                                                            49026
                  [Action, Adventure, ScienceFiction]
                                                            49529
                                                   keywords \
      0 [cultureclash, future, spacewar, spacecolony, ...
      1 [ocean, drugabuse, exoticisland, eastindiatrad...
      2 [spy, basedonnovel, secretagent, sequel, mi6, ...
      3 [dccomics, crimefighter, terrorist, secretiden...
      4 [basedonnovel, mars, medallion, spacetravel, p...
      0 [In, the, 22nd, century,, a, paraplegic, Marin...
      1 [Captain, Barbossa,, long, believed, to, be, d...
      2 [A, cryptic, message, from, Bond's, past, send...
      3 [Following, the, death, of, District, Attorney...
      4 [John, Carter, is, a, war-weary,, former, mili...
                                             title \
      0
      1 Pirates of the Caribbean: At World's End
      2
                                           Spectre
      3
                            The Dark Knight Rises
      4
                                       John Carter
                                                                        crew
         [SamWorthington, ZoeSaldana, SigourneyWeaver]
                                                              [JamesCameron]
```

2

```
1
            [JohnnyDepp, OrlandoBloom, KeiraKnightley]
                                                             [GoreVerbinski]
      2
             [DanielCraig, ChristophWaltz, LéaSeydoux]
                                                                 [SamMendes]
      3
             [ChristianBale, MichaelCaine, GaryOldman]
                                                          [ChristopherNolan]
           [TaylorKitsch, LynnCollins, SamanthaMorton]
      4
                                                             [AndrewStanton]
[32]: #combining all columns to a single column to get tags
      movies["tags"]=movies["genres"]+movies["keywords"]+movies["overview"]+movies["cast"]+movies["c
[33]:
     movies.head()
[33]:
                                                genres
                                                         movie_id \
         [Action, Adventure, Fantasy, ScienceFiction]
      0
                                                            19995
      1
                          [Adventure, Fantasy, Action]
                                                              285
      2
                            [Action, Adventure, Crime]
                                                           206647
      3
                      [Action, Crime, Drama, Thriller]
                                                            49026
      4
                  [Action, Adventure, ScienceFiction]
                                                            49529
                                                   keywords \
         [cultureclash, future, spacewar, spacecolony, ...
      1 [ocean, drugabuse, exoticisland, eastindiatrad...
      2 [spy, basedonnovel, secretagent, sequel, mi6, ...
      3 [dccomics, crimefighter, terrorist, secretiden...
      4 [basedonnovel, mars, medallion, spacetravel, p...
                                                   overview \
       [In, the, 22nd, century,, a, paraplegic, Marin...
      1 [Captain, Barbossa,, long, believed, to, be, d...
      2 [A, cryptic, message, from, Bond's, past, send...
      3 [Following, the, death, of, District, Attorney...
      4 [John, Carter, is, a, war-weary,, former, mili...
                                             title \
      0
                                            Avatar
        Pirates of the Caribbean: At World's End
                                           Spectre
      3
                             The Dark Knight Rises
      4
                                       John Carter
                                                                        crew
                                                    cast
         [SamWorthington, ZoeSaldana, SigourneyWeaver]
                                                              [JamesCameron]
      0
      1
            [JohnnyDepp, OrlandoBloom, KeiraKnightley]
                                                             [GoreVerbinski]
      2
             [DanielCraig, ChristophWaltz, LéaSeydoux]
                                                                 [SamMendes]
      3
             [ChristianBale, MichaelCaine, GaryOldman]
                                                          [ChristopherNolan]
           [TaylorKitsch, LynnCollins, SamanthaMorton]
                                                             [AndrewStanton]
                                                        tags
```

[Action, Adventure, Fantasy, ScienceFiction, c...

```
2 [Action, Adventure, Crime, spy, basedonnovel, ...
      3 [Action, Crime, Drama, Thriller, dccomics, cri...
      4 [Action, Adventure, ScienceFiction, basedonnov...
[34]: new_df=movies[["title", "movie_id", "tags"]]
[35]: new_df.head()
[35]:
                                             title movie id \
      0
                                            Avatar
                                                       19995
      1 Pirates of the Caribbean: At World's End
                                                         285
                                           Spectre
                                                      206647
      3
                            The Dark Knight Rises
                                                       49026
                                       John Carter
      4
                                                       49529
                                                       tags
      O [Action, Adventure, Fantasy, ScienceFiction, c...
      1 [Adventure, Fantasy, Action, ocean, drugabuse,...
      2 [Action, Adventure, Crime, spy, basedonnovel, ...
      3 [Action, Crime, Drama, Thriller, dccomics, cri...
      4 [Action, Adventure, ScienceFiction, basedonnov...
[36]: #converting tags column to a string
      new_df["tags"] = new_df["tags"].apply(lambda x : ' '.join(x))
     C:\Users\KEERTHAN\AppData\Local\Temp\ipykernel_11988\2105490204.py:2:
     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))
[37]: new df.head()
[37]:
                                             title movie_id \
                                                       19995
      0
                                            Avatar
        Pirates of the Caribbean: At World's End
      1
                                                         285
      2
                                           Spectre
                                                      206647
      3
                            The Dark Knight Rises
                                                       49026
      4
                                       John Carter
                                                       49529
```

1 [Adventure, Fantasy, Action, ocean, drugabuse,...

13

Action Adventure Fantasy ScienceFiction cultur...
Adventure Fantasy Action ocean drugabuse exoti...
Action Adventure Crime spy basedonnovel secret...

tags

- 3 Action Crime Drama Thriller dccomics crimefigh...
- 4 Action Adventure ScienceFiction basedonnovel m...

```
[38]: #converting tags column to all lower case
new_df["tags"]=new_df["tags"].apply(lambda x : x.lower())
```

C:\Users\KEERTHAN\AppData\Local\Temp\ipykernel_11988\2760261440.py:2:
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())

[39]: new_df

[39]:		title	e movie_id	\
	0	Avata	r 19995	
	1	Pirates of the Caribbean: At World's End	d 285	
	2	Spectro	e 206647	
	3	The Dark Knight Rise	s 49026	
	4	John Carte	r 49529	
	•••	•••	•••	
	4804	El Mariach	i 9367	
	4805	Newlywed	s 72766	
	4806	Signed, Sealed, Delivered	d 231617	
	4807	Shanghai Callin	g 126186	
	4808	My Date with Dre	w 25975	
		·		

				tag
action	adventure	fantasy	sciencefiction	cultur

- action adventure fantasy sciencefiction cultur...adventure fantasy action ocean drugabuse exoti...
- 2 action adventure crime spy basedonnovel secret...
- 3 action crime drama thriller dccomics crimefigh...
- 4 action adventure sciencefiction basedonnovel m...

4804 action crime thriller unitedstates-mexicobarri...

- 4805 comedy romance a newlywed couple's honeymoon i...
- 4806 comedy drama romance tymovie date loveatfirsts...
- 4807 when ambitious new york attorney sam is sent t...
- 4808 documentary obsession camcorder crush dreamgir...

[4806 rows x 3 columns]

4 Stemming

```
[74]: |#to remove repeated words in tags like loving, loved, lovable and all as it_{11}
       →affects in vectorization stemming is being used
      import nltk
[76]: from nltk.stem.porter import PorterStemmer
      ps=PorterStemmer()
[77]: def stem(text):
          y=[]
          for i in text.split():
              y.append(ps.stem(i))
          return ' '.join(y)
[78]: new_df["tags"]=new_df["tags"].apply(stem)
     C:\Users\KEERTHAN\AppData\Local\Temp\ipykernel_11988\1027202188.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)
[79]: new_df.head()
[79]:
                                             title
                                                    movie_id \
      0
                                            Avatar
                                                       19995
        Pirates of the Caribbean: At World's End
                                                         285
      1
      2
                                           Spectre
                                                      206647
      3
                            The Dark Knight Rises
                                                       49026
                                       John Carter
      4
                                                       49529
                                                       tags
      O action adventur fantasi sciencefict culturecla...
      1 adventur fantasi action ocean drugabus exotici...
      2 action adventur crime spi basedonnovel secreta...
      3 action crime drama thriller dccomic crimefight...
      4 action adventur sciencefict basedonnovel mar m...
```

5 Vectorization

Why Vectorization?

we are ready with the dataset to work with now for our requirement

converting all tags to a vector in dimensional space so that based on the distances between the vectors similarity can be calculated hence movie can be recommended

so we combine all the tags and count the max say 5000 most frequent words and then check each frequent word count for eqch movie(i.e in tag of that movie) which actually represent a vector

we can see it has been converted to a (4806, 5000) approx 5k dimensional space so each movie is a vector

means that 4806 movies ka each column of 5k repeated words whether that is present in the movie or not and plotted based on it

Starting Similarity between vectors

we are using cosine distance(angles) not eucledian as dimension increases eucledian is less significant

```
[84]: from sklearn.metrics.pairwise import cosine_similarity
[85]:
      similarity=cosine_similarity(vector)
[86]:
      similarity
                        , 0.08346223, 0.0860309 , ..., 0.04499213, 0.
[86]: array([[1.
              0.
                        ],
             [0.08346223, 1.
                                    , 0.06063391, ..., 0.02378257, 0.
              0.02615329],
                                              , ..., 0.02451452, 0.
             [0.0860309 , 0.06063391, 1.
              0.
                        ],
             [0.04499213, 0.02378257, 0.02451452, ..., 1., 0.03962144,
              0.04229549],
```

```
[0.
                                      , 0. , ..., 0.03962144, 1.
                         , 0.
               0.08714204],
                         , 0.02615329, 0.
                                                  , ..., 0.04229549, 0.08714204,
              [0.
                         ]])
               1.
[87]: similarity.shape
[87]: (4806, 4806)
      so each movie of 4806 movies ka distance is calculated with the all 4806 movies
[90]: similarity[0] #represent movie 1 ka distance with all 4806 movies
                        , 0.08346223, 0.0860309 , ..., 0.04499213, 0.
[90]: array([1.
              0.
                        1)
         Recommending
[97]: def recommend(movie):
           movie_indices = new_df[new_df["title"] == movie].index
           if len(movie_indices) == 0:
               print(f"Sorry, '{movie}' is not found in the dataset.")
               return
           movie_index = movie_indices[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)
[101]: #asking input and recommending movies
       mov=str(input("Please enter movie name \n"))
       print("Recommended movies are \n")
       recommend(mov)
      Please enter movie name
      Batman Begins
      Recommended movies are
      The Dark Knight
      Batman
      Batman
      The Dark Knight Rises
      10th & Wolf
      The Name of the movie entered should be proper and according to the name in the dataset
```

DONE!!!