

Movie Recommendation System

```
In [5]: # Importing required Libraries
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
import os
for dirname, _, filenames in os.walk('/dataset'):
    for filename in filenames:
        print(os.path.join(dirname, filename))
# Exporting dataset
movies = pd.read_csv('tmdb_5000_movies.csv')
credits = pd.read_csv('tmdb_5000_credits.csv')
movies.head()
```

```
Out[5]:
```

	budget	genres	homepage	id	keywords	original_language
0	237000000	[{"id": 28, "name": "Action"}, {"id": 12, "name": "Adventure"}]	http://www.avatarmovie.com/	19995	[{"id": 1463, "name": "culture clash"}, {"id": 1464, "name": "culture clash"}]	en
1	300000000	[{"id": 12, "name": "Adventure"}, {"id": 14, "name": "Fantasy"}]	http://disney.go.com/disneypictures/pirates/	285	[{"id": 270, "name": "ocean"}, {"id": 726, "name": "pirates"}]	en
2	245000000	[{"id": 28, "name": "Action"}, {"id": 12, "name": "Adventure"}]	http://www.sonypictures.com/movies/spectre/	206647	[{"id": 470, "name": "spy"}, {"id": 818, "name": "spy"}]	en
3	250000000	[{"id": 28, "name": "Action"}, {"id": 80, "name": "Fantasy"}]	http://www.thedarkknighttrises.com/	49026	[{"id": 849, "name": "dc comics"}, {"id": 853, "name": "dc comics"}]	en
4	260000000	[{"id": 28, "name": "Action"}, {"id": 12, "name": "Adventure"}]	http://movies.disney.com/john-carter	49529	[{"id": 818, "name": "based on novel"}, {"id": 819, "name": "based on novel"}]	en

In [6]:

movies.shape

Out[6]: (4803, 20)

In [7]:

credits.head()

Out[7]:

	movie_id	title	cast	crew
0	19995	Avatar	[{"cast_id": 242, "character": "Jake Sully", "...	[{"credit_id": "52fe48009251416c750aca23", "de...
1	285	Pirates of the Caribbean: At World's End	[{"cast_id": 4, "character": "Captain Jack Spa...	[{"credit_id": "52fe4232c3a36847f800b579", "de...
2	206647	Spectre	[{"cast_id": 1, "character": "James Bond", "cr...	[{"credit_id": "54805967c3a36829b5002c41", "de...
3	49026	The Dark Knight Rises	[{"cast_id": 2, "character": "Bruce Wayne / Ba...	[{"credit_id": "52fe4781c3a36847f81398c3", "de...
4	49529	John Carter	[{"cast_id": 5, "character": "John Carter", "c...	[{"credit_id": "52fe479ac3a36847f813eaa3", "de...

In [8]:

credits.shape

Out[8]: (4803, 4)

In [9]:

```
# Merging two tables (movies and credits tables)
movies = movies.merge(credits,on='title')
```

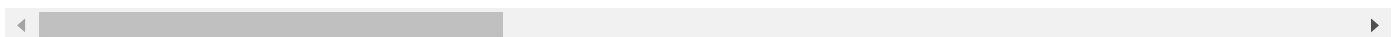
In [10]:

movies.head()

Out[10]:

	budget	genres	homepage	id	keywords	original_language
0	237000000	[{"id": 28, "name": "Action"}, {"id": 12, "name": "Adventure"}]	http://www.avatarmovie.com/	19995	[{"id": 1463, "name": "culture clash"}, {"id": 1464, "name": "culture clash"}]	
1	300000000	[{"id": 12, "name": "Adventure"}, {"id": 14, "name": "Fantasy"}]	http://disney.go.com/disneypictures/pirates/	285	[{"id": 270, "name": "ocean"}, {"id": 726, "name": "pirates"}]	
2	245000000	[{"id": 28, "name": "Action"}, {"id": 12, "name": "Adventure"}]	http://www.sonypictures.com/movies/spectre/	206647	[{"id": 470, "name": "spy"}, {"id": 818, "name": "spy"}]	
3	250000000	[{"id": 28, "name": "Action"}, {"id": 80, "name": "Fantasy"}]	http://www.thedarkknightises.com/	49026	[{"id": 849, "name": "dc comics"}, {"id": 853, "name": "dc comics"}]	
4	260000000	[{"id": 28, "name": "Action"}, {"id": 12, "name": "Adventure"}]	http://movies.disney.com/john-carter	49529	[{"id": 818, "name": "based on novel"}, {"id": 1464, "name": "culture clash"}]	

5 rows × 23 columns

In [11]: `movies.shape`Out[11]: `(4809, 23)`In [12]: `movies.info()`

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 4809 entries, 0 to 4808
Data columns (total 23 columns):
#   Column                Non-Null Count  Dtype
---  -
0   budget                4809 non-null   int64
1   genres                4809 non-null   object
2   homepage              1713 non-null   object
3   id                    4809 non-null   int64
4   keywords              4809 non-null   object
5   original_language     4809 non-null   object
6   original_title        4809 non-null   object
7   overview              4806 non-null   object
8   popularity            4809 non-null   float64
9   production_companies  4809 non-null   object
10  production_countries  4809 non-null   object
11  release_date          4808 non-null   object
12  revenue               4809 non-null   int64
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
18  vote_average          4809 non-null   float64
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
```

```
In [13]: # Remove unnecessary columns "budget,homepage,id,original_language,original_title,popu
# Accesing required and important columns are('movie_id','title','overview','genres',
movies = movies[['movie_id','title','overview','genres','keywords','cast','crew']]
```

```
In [14]: movies.head()
```

Out[14]:

movie_id	title	overview	genres	keywords	cast	crew
1	THE DARK KNIGHT TRILOGY	When Batman returns to Gotham City, he is forced to confront the Joker, a madman who is bent on destroying the city.	Action, Crime, Drama	Batman, Gotham City, Joker, The Dark Knight	Christian Bale, Michael Keaton, Aaron Eckhart, Morgan Freeman	Christopher Nolan
2	THE DARK KNIGHT RETURNS	When Batman returns to Gotham City, he is forced to confront the Joker, a madman who is bent on destroying the city.	Action, Crime, Drama	Batman, Gotham City, Joker, The Dark Knight	Christian Bale, Michael Keaton, Aaron Eckhart, Morgan Freeman	Christopher Nolan
3	THE DARK KNIGHT TRILOGY	When Batman returns to Gotham City, he is forced to confront the Joker, a madman who is bent on destroying the city.	Action, Crime, Drama	Batman, Gotham City, Joker, The Dark Knight	Christian Bale, Michael Keaton, Aaron Eckhart, Morgan Freeman	Christopher Nolan
4	THE DARK KNIGHT TRILOGY	When Batman returns to Gotham City, he is forced to confront the Joker, a madman who is bent on destroying the city.	Action, Crime, Drama	Batman, Gotham City, Joker, The Dark Knight	Christian Bale, Michael Keaton, Aaron Eckhart, Morgan Freeman	Christopher Nolan
5	THE DARK KNIGHT TRILOGY	When Batman returns to Gotham City, he is forced to confront the Joker, a madman who is bent on destroying the city.	Action, Crime, Drama	Batman, Gotham City, Joker, The Dark Knight	Christian Bale, Michael Keaton, Aaron Eckhart, Morgan Freeman	Christopher Nolan
6	THE DARK KNIGHT TRILOGY	When Batman returns to Gotham City, he is forced to confront the Joker, a madman who is bent on destroying the city.	Action, Crime, Drama	Batman, Gotham City, Joker, The Dark Knight	Christian Bale, Michael Keaton, Aaron Eckhart, Morgan Freeman	Christopher Nolan
7	THE DARK KNIGHT TRILOGY	When Batman returns to Gotham City, he is forced to confront the Joker, a madman who is bent on destroying the city.	Action, Crime, Drama	Batman, Gotham City, Joker, The Dark Knight	Christian Bale, Michael Keaton, Aaron Eckhart, Morgan Freeman	Christopher Nolan
8	THE DARK KNIGHT TRILOGY	When Batman returns to Gotham City, he is forced to confront the Joker, a madman who is bent on destroying the city.	Action, Crime, Drama	Batman, Gotham City, Joker, The Dark Knight	Christian Bale, Michael Keaton, Aaron Eckhart, Morgan Freeman	Christopher Nolan
9	THE DARK KNIGHT TRILOGY	When Batman returns to Gotham City, he is forced to confront the Joker, a madman who is bent on destroying the city.	Action, Crime, Drama	Batman, Gotham City, Joker, The Dark Knight	Christian Bale, Michael Keaton, Aaron Eckhart, Morgan Freeman	Christopher Nolan
10	THE DARK KNIGHT TRILOGY	When Batman returns to Gotham City, he is forced to confront the Joker, a madman who is bent on destroying the city.	Action, Crime, Drama	Batman, Gotham City, Joker, The Dark Knight	Christian Bale, Michael Keaton, Aaron Eckhart, Morgan Freeman	Christopher Nolan

"52fe48009251416c750aca23",

"52fe4232c3a36847f800b579",

"54805967c3a36829b5002c41",

"52fe4781c3a36847f81398c3",

"52fe479ac3a36847f813eaa3",
"de..."

```
In [15]: # Finding NULL values
movies.isna().sum()
```

```
Out[15]: movie_id    0
title        0
overview     3
genres       0
keywords     0
cast         0
crew         0
dtype: int64
```

```
In [16]: # Removing NULL values
movies.dropna(inplace=True)
```

```
In [17]: # This Library perform a collection of nodes which are Linked together based on the gr
import ast
```

```
In [19]: # Accesing only genres 'name' from the genres table
movies['genres'] = movies['genres'].apply(convert)
movies.head()
```

◀ ▶

6/15


```
Out[23]: 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...
...
4804 [{"cast_id": 1, "character": "El Mariachi", "c...
4805 [{"cast_id": 1, "character": "Buzzy", "credit_...
4806 [{"cast_id": 8, "character": "Oliver O\u2019To...
4807 [{"cast_id": 3, "character": "Sam", "credit_id...
4808 [{"cast_id": 3, "character": "Herself", "credi...
Name: cast, Length: 4806, dtype: object
```

```
In [24]: # Converting top 3 list of dictionary into just list
movies['cast'] = movies['cast'].apply(convert)
movies.head()
```

[illegible]

```
In [25]: movies['cast']
```



```
Out[25]: 0      [Sam Worthington, Zoe Saldana, Sigourney Weave...
1      [Johnny Depp, Orlando Bloom, Keira Knightley, ...
2      [Daniel Craig, Christoph Waltz, Léa Seydoux, R...
3      [Christian Bale, Michael Caine, Gary Oldman, A...
4      [Taylor Kitsch, Lynn Collins, Samantha Morton,...
...
4804   [Carlos Gallardo, Jaime de Hoyos, Peter Marqua...
4805   [Edward Burns, Kerry Bishé, Marsha Dietlein, C...
4806   [Eric Mabiús, Kristin Booth, Crystal Lowe, Geo...
4807   [Daniel Henney, Eliza Coupe, Bill Paxton, Alan...
4808   [Drew Barrymore, Brian Herzlinger, Corey Feldm...
Name: cast, Length: 4806, dtype: object
```

```
In [27]: # Accessing top 3 actor name from the cast table we dont require lots of actor name
movies['cast'] = movies['cast'].apply(lambda x:x[0:3])
movies['cast']
```

```
Out[27]: 0      [Sam Worthington, Zoe Saldana, Sigourney Weaver]
1      [Johnny Depp, Orlando Bloom, Keira Knightley]
2      [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 Mabiús, Kristin Booth, Crystal Lowe]
4807   [Daniel Henney, Eliza Coupe, Bill Paxton]
4808   [Drew Barrymore, Brian Herzlinger, Corey Feldman]
Name: cast, Length: 4806, dtype: object
```

```
In [28]: # This function fetch the director name from the crew feature
def fetch_director(text):
    L = []
    for i in ast.literal_eval(text):
        if i['job'] == 'Director':
            L.append(i['name'])
    return L
```

```
In [29]: # Accessing director name from crew column
movies['crew'] = movies['crew'].apply(fetch_director)
movies.sample(5)
```

Out[29]:

movie_id	title	year	genre	director	cast	crew
2766	Star Wars	1977	Science Fiction	George Lucas	[Mark Hamill, Harrison Ford, Carrie Fisher]	[George Lucas]
2766	Room	2015	[Drama, Thriller]	[based on novel, carpet, kidnapping...]	[Liam Neeson, Brie Larson, Jacob Tremblay, Joan Allen]	[Liam Neeson, Brie Larson, Jacob Tremblay, Joan Allen]
2766	Death Sentence	2008	Action, Crime, Drama, Thriller	[based on novel, carpet, kidnapping...]	[Sam Worthington, Michael Biehn, James Van Der Beek, James Wolk]	[Sam Worthington, Michael Biehn, James Van Der Beek, James Wolk]
2766	There's a Boy in the Girls' Bathroom	1983	[Comedy]	[based on novel, carpet, kidnapping...]	[Jeffrey Tambor, John Goodman, John Goodman]	[Jeffrey Tambor, John Goodman, John Goodman]
2766	The 400 Blows	1959	[Drama]	[based on novel, carpet, kidnapping...]	[Jean-Pierre L��aud, Jean-Pierre L��aud]	[Jean-Pierre L��aud, Jean-Pierre L��aud]

```
In [30]: # This functions removes the whitespace from the name because we want name unique some
# name sam bilings and sam johnny but we focusing only first name but our ML Model wil
# removing white spaces from features
def collapse(L):
    L1 = []
    for i in L:
        L1.append(i.replace(" ", ""))
    return L1
```

```
In [31]: movies['cast'].head()
```

```
Out[31]: 0    [Sam Worthington, Zoe Saldana, Sigourney Weaver]
1    [Johnny Depp, Orlando Bloom, Keira Knightley]
2    [Daniel Craig, Christoph Waltz, L  a Seydoux]
3    [Christian Bale, Michael Caine, Gary Oldman]
4    [Taylor Kitsch, Lynn Collins, Samantha Morton]
Name: cast, dtype: object
```

```
In [33]: # Applying whitespace remove function to cast-->'Actor name'
movies['cast'] = movies['cast'].apply(collapse)
```

```
In [34]: movies['cast']
```

```
Out[34]: 0      [SamWorthington, ZoeSaldana, SigourneyWeaver]
1      [JohnnyDepp, OrlandoBloom, KeiraKnightley]
2      [DanielCraig, ChristophWaltz, LéaSeydoux]
3      [ChristianBale, MichaelCaine, GaryOldman]
4      [TaylorKitsch, LynnCollins, SamanthaMorton]
...
4804   [CarlosGallardo, JaimeHoyos, PeterMarquardt]
4805   [EdwardBurns, KerryBishé, MarshaDietlein]
4806   [EricMabius, KristinBooth, CrystalLowe]
4807   [DanielHenney, ElizaCoupe, BillPaxton]
4808   [DrewBarrymore, BrianHerzlinger, CoreyFeldman]
Name: cast, Length: 4806, dtype: object
```

```
In [35]: movies['crew'].head()
```

```
Out[35]: 0      [James Cameron]
1      [Gore Verbinski]
2      [Sam Mendes]
3      [Christopher Nolan]
4      [Andrew Stanton]
Name: crew, dtype: object
```

```
In [36]: # Applying whitespace remove function to crew table-->'director name'
movies['crew'] = movies['crew'].apply(collapse)
```

```
In [37]: movies['crew'].head()
```

```
Out[37]: 0      [JamesCameron]
1      [GoreVerbinski]
2      [SamMendes]
3      [ChristopherNolan]
4      [AndrewStanton]
Name: crew, dtype: object
```

```
In [38]: # Applying whitespace remove function to genres ---> type of movies
movies['genres'] = movies['genres'].apply(collapse)

# Applying whitespace remove function to keywords
movies['keywords'] = movies['keywords'].apply(collapse)
```

```
In [39]: movies.head()
```

Out[39]:

	movie_id	title	overview	genres	keywords	cast	crew
			In the 22nd century, a paranoid planet is attacked by...	Action, Adventure, Fantasy, Science Fiction	Future, Space, Space Colony, ...	[SamWorthington, ZoeSaldana, SigourneyWeaver]	[JamesCameron]
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]	[GoreVerbinski]
2	206647	Spectre	A cryptic message from Bond's past sends him o...	[Action, Adventure, Crime]	[spy, basedonnovel, secretagent, sequel, mi6, ...	[DanielCraig, ChristophWaltz, LéaSeydoux]	[SamMendes]
3	49026	The Dark Knight Rises	Following the death of District Attorney Harve...	[Action, Crime, Drama, Thriller]	[dccomics, crimefighter, terrorist, secretiden...	[ChristianBale, MichaelCaine, GaryOldman]	[ChristopherNolan]
4	49529	John Carter	John Carter is a war-weary, former military ca...	[Action, Adventure, ScienceFiction]	[basedonnovel, mars, medallion, spacetravel, p...	[TaylorKitsch, LynnCollins, SamanthaMorton]	[AndrewStanton]

```
In [40]: # Splitting the each word in overview columns
movies['overview'] = movies['overview'].apply(lambda x:x.split())

In [41]: # Adding overview,genres,keywords,cast and crew added into a one table --> tag table t
movies['tags'] = movies['overview'] + movies['genres'] + movies['keywords'] + movies['cast'] + movies['crew']

In [42]: # Removing the columns overview,genres,keywords,cast, crew
new = movies.drop(columns=['overview','genres','keywords','cast','crew'])

In [43]: new['tags']
```

```
Out[43]: 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...

...

4804    [El, Mariachi, just, wants, to, play, his, gui...
4805    [A, newlywed, couple's, honeymoon, is, upended...
4806    ["Signed,, Sealed,, Delivered", introduces, a,...
4807    [When, ambitious, New, York, attorney, Sam, is...
4808    [Ever, since, the, second, grade, when, he, fi...
Name: tags, Length: 4806, dtype: object
```

```
In [44]: new['tags'] = new['tags'].apply(lambda x: " ".join(x))
new.head()
```

```
Out[44]:
```

	movie_id	title	tags
0	19995	Avatar	In the 22nd century, a paraplegic Marine is di...
1	285	Pirates of the Caribbean: At World's End	Captain Barbossa, long believed to be dead, ha...
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...

```
In [45]: new['tags']
```

```
Out[45]: 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...
4      John Carter is a war-weary, former military ca...

...

4804    El Mariachi just wants to play his guitar and ...
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 ...
Name: tags, Length: 4806, dtype: object
```

```
In [46]: ## Vectorization
# Importing Vectorization Library
from sklearn.feature_extraction.text import CountVectorizer

# Vectorizing data into 5000 features and applying stop words it removes the uncessar
cv = CountVectorizer(max_features=5000, stop_words='english')
```

```
In [47]: # Fit the tag table data
vector = cv.fit_transform(new['tags']).toarray()
```

```
In [48]: vector.shape
```

```
Out[48]: (4806, 5000)
```

```
In [49]: # Importing cosine similarity
from sklearn.metrics.pairwise import cosine_similarity
```

```
In [50]: # cosine similarity ---> this perform like it get the words which is similar like (low
similarity = cosine_similarity(vector)
```

```
In [51]: # Accesing index value from movie title column
new[new['title'] == 'The Lego Movie'].index[0]
```

```
Out[51]: 744
```

```
In [52]: # In this function we first add the movie title
def recommend(movie):
    index = new[new['title'] == movie].index[0]
    # Getting similarity movies in ascending order
    distances = sorted(list(enumerate(similarity[index])),reverse=True,key = lambda x:
    # Just picking top 5 movie which have more similarity to the movie by through index
    for i in distances[1:6]:
        print(new.iloc[i[0]].title)
```

Recommendation Movies (Test)

```
In [53]: # Recommending the movie 1
recommend('Gandhi')
```

Gandhi, My Father
The Wind That Shakes the Barley
A Passage to India
Guiana 1838
Ramanujan

```
In [54]: # Recommending the movie 2
recommend('The Lego Movie')
```

The Adventures of Rocky & Bullwinkle
The Boxtrolls
Curious George
Percy Jackson: Sea of Monsters
Penguins of Madagascar

```
In [55]: # Recommending the movie 3
recommend('Lucy')
```

The Helix... Loaded
Species
Jupiter Ascending
Phenomenon
Godzilla 2000

```
In [56]: # Recommending the movie 4
recommend('Madagascar')
```

Roar
Madagascar: Escape 2 Africa
The Wild Thornberrys Movie
Rugrats Go Wild
Nicholas Nickleby

```
In [57]: # Recommending the movie 5  
recommend('Gossip')
```

The Lunchbox
Griff the Invisible
Rocket Singh: Salesman of the Year
Far from Heaven
The Bridges of Madison County

```
In [ ]:
```