### **Dataset Information**

Million Songs Dataset contains of two files: triplet\_file and metadata\_file. The triplet\_file contains user\_id, song\_id and listen time. The metadata\_file contains song\_id, title, release, year and artist\_name. Million Songs Dataset is a mixture of song from various website with the rating that users gave after listening to the song.

There are 3 types of recommendation system: content-based, collaborative and popularity.

## Import modules

```
In [3]: import pandas as pd
import numpy as np
import Recommenders as Recommenders
```

### Loading the dataset

```
In [4]: song_df_1 = pd.read_csv('triplets_file.csv')
song_df_1.head()
```

#### Out[4]:

listen_count	song_id	user_id	
1	SOAKIMP12A8C130995	b80344d063b5ccb3212f76538f3d9e43d87dca9e	0
2	SOBBMDR12A8C13253B	b80344d063b5ccb3212f76538f3d9e43d87dca9e	1
1	SOBXHDL12A81C204C0	<b>2</b> b80344d063b5ccb3212f76538f3d9e43d87dca9e	2
1	SOBYHAJ12A6701BF1D	b80344d063b5ccb3212f76538f3d9e43d87dca9e	3
1	SODACBL12A8C13C273	<b>b</b> 80344d063b5ccb3212f76538f3d9e43d87dca9e	4

```
In [5]: song_df_2 = pd.read_csv('song_data.csv')
song_df_2.head()
```

#### Out[5]:

year	artist_name	release	title	song_id	
2003	Faster Pussy cat	Monster Ballads X-Mas	Silent Night	SOQMMHC12AB0180CB8	0
1995	Karkkiautomaatti	Karkuteillä	Tanssi vaan	SOVFVAK12A8C1350D9	1
2006	Hudson Mohawke	Butter	No One Could Ever	SOGTUKN12AB017F4F1	2
2003	Yerba Brava	De Culo	Si Vos Querés	SOBNYVR12A8C13558C	3
0	Der Mystic	Rene Ablaze Presents Winter Sessions	Tangle Of Aspens	SOHSBXH12A8C13B0DF	4

```
In [9]: # combine both data
        song_df = pd.merge(song_df_1, song_df_2.drop_duplicates(['song_id']), on='song_
        song_df.head()
```

#### Out[9]:

		user_id	song_id	listen_count	title
	0	b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOAKIMP12A8C130995	1	The Cove
	1	b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOBBMDR12A8C13253B	2	Entre Dos Aguas
	2	b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOBXHDL12A81C204C0	1	Stronger
	3	b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOBYHAJ12A6701BF1D	1	Constellations
	4	b80344d063b5ccb3212f76538f3d9e43d87dca9e	SODACBL12A8C13C273	1	Learn To Fly
	4				•
[11]:	р	rint(len(song_df_1), len(song_df_2))	)		
_	20	00000 1000000			

In [

2000000 1000000

In [12]: len(song\_df)

Out[12]: 2000000

## **Data Preprocessing**

```
In [13]: # creating new feature combining title and artist name
song_df['song'] = song_df['title']+'-'+song_df['artist_name']
song_df.head()
```

#### Out[13]:

title	listen_count	song_id	user_id
The Cove	1	SOAKIMP12A8C130995	b80344d063b5ccb3212f76538f3d9e43d87dca9e
Entre Dos Aguas	2	SOBBMDR12A8C13253B	b80344d063b5ccb3212f76538f3d9e43d87dca9e
Stronger	1	SOBXHDL12A81C204C0	b80344d063b5ccb3212f76538f3d9e43d87dca9e
Constellations	1	SOBYHAJ12A6701BF1D	b80344d063b5ccb3212f76538f3d9e43d87dca9e
Learn To Fly	1	SODACBL12A8C13C273	b80344d063b5ccb3212f76538f3d9e43d87dca9e
•			

```
In [14]: # taking top 10k samples for quick results
song_df = song_df.head(10000)
```

In [16]: # cummulative sum of listen count of the songs
song\_grouped = song\_df.groupby(['song']).agg({'listen\_count' : 'count'}).reset\_
song\_grouped.head()

#### Out[16]:

	song	listen_count
0	#40-DAVE MATTHEWS BAND	1
1	& Down-Boys Noize	4
2	'97 Bonnie & Clyde-Eminem	2
3	'Round Midnight-Miles Davis	3
4	'Till I Collapse-Eminem / Nate Dogg	6

```
In [17]: grouped_sum = song_grouped['listen_count'].sum()
    song_grouped['percentage'] = (song_grouped['listen_count'] / grouped_sum) * 100
    song_grouped.sort_values(['listen_count','song'],ascending=[0,1])
```

#### Out[17]:

	song	listen_count	percentage
3660	Sehr kosmisch-Harmonia	45	0.45
4678	Undo-Björk	32	0.32
5105	You're The One-Dwight Yoakam	32	0.32
1071	Dog Days Are Over (Radio Edit)-Florence + The	28	0.28
3655	Secrets-OneRepublic	28	0.28
		•••	
5139	high fives-Four Tet	1	0.01
5140	in white rooms-Booka Shade	1	0.01
5143	paranoid android-Christopher O'Riley	1	0.01
5149	¿Lo Ves? [Piano Y Voz]-Alejandro Sanz	1	0.01
5150	Época-Gotan Project	1	0.01

5151 rows × 3 columns

## **Popularity Recommendation Engine**

```
In [18]: pr = Recommenders.popularity_recommender_py()
In [19]: pr.create(song_df, 'user_id','song')
```

```
In [20]: # display the top 10 popular songs
pr.recommend(song_df['user_id'][5])
```

#### Out[20]:

	user_id	song	score	Rank
3660	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Sehr kosmisch-Harmonia	45	1.0
4678	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Undo-Björk	32	2.0
5105	b80344d063b5ccb3212f76538f3d9e43d87dca9e	You're The One-Dwight Yoakam	32	3.0
1071	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Dog Days Are Over (Radio Edit)- Florence + The	28	4.0
3655	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Secrets-OneRepublic	28	5.0
4378	b80344d063b5ccb3212f76538f3d9e43d87dca9e	The Scientist-Coldplay	27	6.0
4712	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Use Somebody-Kings Of Leon	27	7.0
3476	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Revelry-Kings Of Leon	26	8.0
1387	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Fireflies-Charttraxx Karaoke	24	9.0
1862	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Horn Concerto No. 4 in E flat K495: II. Romanc	23	10.0

In [21]: pr.recommend(song\_df['user\_id'][100])

#### Out[21]:

	user_id	song	score	Rank
3660	e006b1a48f466bf59feefed32bec6494495a4436	Sehr kosmisch-Harmonia	45	1.0
4678	e006b1a48f466bf59feefed32bec6494495a4436	Undo-Björk	32	2.0
5105	e006b1a48f466bf59feefed32bec6494495a4436	You're The One-Dwight Yoakam	32	3.0
1071	e006b1a48f466bf59feefed32bec6494495a4436	Dog Days Are Over (Radio Edit)- Florence + The	28	4.0
3655	e006b1a48f466bf59feefed32bec6494495a4436	Secrets-OneRepublic	28	5.0
4378	e006b1a48f466bf59feefed32bec6494495a4436	The Scientist-Coldplay	27	6.0
4712	e006b1a48f466bf59feefed32bec6494495a4436	Use Somebody-Kings Of Leon	27	7.0
3476	e006b1a48f466bf59feefed32bec6494495a4436	Revelry-Kings Of Leon	26	8.0
1387	e006b1a48f466bf59feefed32bec6494495a4436	Fireflies-Charttraxx Karaoke	24	9.0
1862	e006b1a48f466bf59feefed32bec6494495a4436	Horn Concerto No. 4 in E flat K495: II. Romanc	23	10.0

# **Item Similarity Recommendation**

```
In [22]: ir = Recommenders.item_similarity_recommender_py()
    ir.create(song_df,'user_id','song')
```

```
In [23]: | user_items = ir.get_user_items(song_df['user_id'][5])
In [24]: # display user songs history
         for user item in user items:
             print(user_item)
         The Cove-Jack Johnson
         Entre Dos Aguas-Paco De Lucia
         Stronger-Kanye West
         Constellations-Jack Johnson
         Learn To Fly-Foo Fighters
         Apuesta Por El Rock 'N' Roll-Héroes del Silencio
         Paper Gangsta-Lady GaGa
         Stacked Actors-Foo Fighters
         Sehr kosmisch-Harmonia
         Heaven's gonna burn your eyes-Thievery Corporation feat. Emiliana Torrini
         Let It Be Sung-Jack Johnson / Matt Costa / Zach Gill / Dan Lebowitz / Steve A
         dams
         I'll Be Missing You (Featuring Faith Evans & 112)(Album Version)-Puff Daddy
         Love Shack-The B-52's
         Clarity-John Mayer
         I?'m A Steady Rollin? Man-Robert Johnson
         The Old Saloon-The Lonely Island
         Behind The Sea [Live In Chicago]-Panic At The Disco
         Champion-Kanye West
         Breakout-Foo Fighters
         Ragged Wood-Fleet Foxes
         Mykonos-Fleet Foxes
         Country Road-Jack Johnson / Paula Fuga
         Oh No-Andrew Bird
         Love Song For No One-John Mayer
         Jewels And Gold-Angus & Julia Stone
         Warning-Incubus
         83-John Mayer
         Neon-John Mayer
         The Middle-Jimmy Eat World
         High and dry-Jorge Drexler
         All That We Perceive-Thievery Corporation
         The Christmas Song (LP Version)-King Curtis
         Our Swords (Soundtrack Version)-Band Of Horses
         Are You In?-Incubus
         Drive-Incubus
         Generator-Foo Fighters
         Come Back To Bed-John Mayer
         He Doesn't Know Why-Fleet Foxes
         Trani-Kings Of Leon
         Bigger Isn't Better-The String Cheese Incident
         Sun Giant-Fleet Foxes
         City Love-John Mayer
         Right Back-Sublime
         Moonshine-Jack Johnson
```

Holes To Heaven-Jack Johnson

# In [25]: # give song recommendation for that user ir.recommend(song\_df['user\_id'][5])

No. of unique songs for the user: 45

no. of unique songs in the training set: 5151 Non zero values in cooccurence\_matrix :6844

#### Out[25]:

	user_id	song	score	rank
0	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Oliver James-Fleet Foxes	0.043076	1
1	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Quiet Houses-Fleet Foxes	0.043076	2
2	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Your Protector-Fleet Foxes	0.043076	3
3	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Tiger Mountain Peasant Song-Fleet Foxes	0.043076	4
4	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Sun It Rises-Fleet Foxes	0.043076	5
5	b80344d063b5ccb3212f76538f3d9e43d87dca9e	The End-Pearl Jam	0.037531	6
6	b80344d063b5ccb3212f76538f3d9e43d87dca9e	St. Elsewhere-Dave Grusin	0.037531	7
7	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Misled-Céline Dion	0.037531	8
8	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Oil And Water-Incubus	0.037531	9
9	b80344d063b5ccb3212f76538f3d9e43d87dca9e	Meadowlarks-Fleet Foxes	0.037531	10

# In [28]: # give related songs based on the words ir.get\_similar\_items(['Oliver James - Fleet Foxes', 'The End - Pearl Jam'])

no. of unique songs in the training set: 5151
Non zero values in cooccurence\_matrix :0

#### Out[28]:

	user_id	song	score	rank
0		Nice Weather For Ducks-Lemon Jelly	0.0	1
1		The Irony Of It All (Album Version)-The Streets	0.0	2
2		Officially Missing You (Radio Version)-Tamia	0.0	3
3		On The Road Again (Pigna People Remix)-Telex	0.0	4
4		What Can Be Safely Written-Nile	0.0	5
5		Lord I Guess I'll Never Know-The Verve	0.0	6
6		Take Em To Church-Cam'Ron / Juelz Santana / Un	0.0	7
7		This Ain't A Scene_ It's An Arms Race-Fall Out	0.0	8
8		Praise You-Fatboy Slim	0.0	9
9		Yeah Yeah-Bodyrox	0.0	10

In [ ]: