

Practical CS5052

Movie Recommender System

I have implemented all three parts and this report will summarize my effort.

Summary Part 1:

In part 1, I have implemented search by user id, search by movie ID or title and search by genre.

For user Id search I have given 7 options,

1. Show titles: shows the titles of the user ID entered.
2. Movies Watched: shows the number of distinct movies watched by a user.
3. Genres Watched: shows the number of genres watched by the user.
4. Genre ratings: shows the average ratings of genres, given by the user.
5. Genre watch count shows the number of movies from each genre watched by the user.
6. Favourite genre based on rating: This gives the favourite genre of the user based on his rating.
7. Favourite genre based on watch count: This gives the favourite genre of the user based on his watch count.

For movie ID and movie name search, I have given 2 options:

1. Watch count: gives the number of times the movie was watched.
2. Rating: gives the average rating of the movie, given by the users.

To give the program user the right movie, I have added the data that matches the letters entered e.g if someone enters “men” or “Men” or any such combination, he will get a list of movies that start with the letters “MEN”.

For Genre search, I have given the option to see all the movies of that genre. Again, I have given the added ability to search if one enters “rom”, he will get romance movies.

I have added the Year search, which gives all the movies from that year.

Lastly for part 1, I have added Top N rated and Top N watched movies, which gives out ‘n’, number entered by user, highest rated or most watched movies.

	title
1	GOONIES, THE (1985)
2	INDIANA JONES AND THE TEMPLE OF DOOM (1984
3	STARSHIP TROOPERS (1997)
4	PREDATOR (1987)
5	SAVING PRIVATE RYAN (1998)
6	SWINGERS (1996)
7	HIGHLANDER (1986)
8	GROUNDHOG DAY (1993)
9	APOCALYPSE NOW (1979)
10	WILD THINGS (1998)
11	I STILL KNOW WHAT YOU DID LAST SUMMER (199
12	SHINING, THE (1980)
13	MCHALE'S NAVY (1997)
14	IRON GIANT, THE (1999)
15	CLEAR AND PRESENT DANGER (1994)
16	ABYSS, THE (1989)
17	CANADIAN BACON (1995)
18	JUNGLE BOOK, THE (1967)
19	LIVE AND LET DIE (1973)
20	WOLF MAN, THE (1941)
21	GRUMPY OLD MEN (1993)
22	GREEN MILE, THE (1999)
23	FIGHT CLUB (1999)
24	FRANKENSTEIN (1931)
25	ESCAPE TO WITCH MOUNTAIN (1975)
26	AUSTIN POWERS: INTERNATIONAL MAN OF MYSTE
27	HOWARD THE DUCK (1986)
28	E.T. THE EXTRA-TERRESTRIAL (1982)
29	HONEY, I SHRUNK THE KIDS (1989)
30	RUSH HOUR (1998)
31	GLADIATOR (2000)
32	ADVENTURES OF ROBIN HOOD, THE (1938)
33	DIRTY DOZEN, THE (1967)
34	LONGEST DAY, THE (1962)
35	GHOST AND THE DARKNESS, THE (1996)
36	THREE AMIGOSI (1986)
37	ROAD WARRIOR, THE (MAD MAX 2) (1981)
38	STAR WARS: EPISODE V - THE EMPIRE STRIKES B
39	MAN WITH THE GOLDEN GUN, THE (1974)

Enter User ID:
1
Show title
Movies watched
Genres watched
Genre ratings
Genre watch count
Favourite genre based on rating
Favourite genre based most viewed
Enter Movie ID:
Rating
Enter Movie's Name:
Watch count
Rating
Enter Genre Name:
Movie list
Enter Year:
Movie list
Enter n:
Top n Highest Rated Movies
Top n Most Watched Movies
Enter User1:
Enter User2:
Compare
Clustered Users according to taste (cluster baskets)
Clustered Users according to taste (UserID wise)
Movie recommendation

Figure 1 user id title list search

python File Edit Window Help
tk
Fri 25 Mar 19:04

Total movies watched by user
1
29

Enter User ID:
2
Show title
Movies watched
Genres watched
Genre ratings
Genre watch count
Favourite genre based on rating
Favourite genre based most viewed
Enter Movie ID:
Rating
Enter Movie's Name:
Watch count
Rating
Enter Genre Name:
Movie list
Enter Year:
Movie list
Enter n:
Top n Highest Rated Movies
Top n Most Watched Movies
Enter User1:
Enter User2:
Connect

Figure 2 user id total movies watched count

Total genres	
1	14

Enter User ID:
2
Show title
Movies watched
Genres watched
Genre ratings
Genre watch count
Favourite genre based on rating
Favourite genre based most viewed
Enter Movie ID:
Rating
Enter Movie's Name:
Watch count
Rating
Enter Genre Name:
Movie list
Enter Year:
Movie list
Enter n:
Top n Highest Rated Movies
Top n Most Watched Movies
Enter User1:
Enter User2:
Compare
Clustered Users according to taste (cluster baskets)
Clustered Users according to taste (UserID wise)
Movie recommendation

Figure 3 user id total genres watched

userid	genres	avg_rating
2	WAR	4.50
2	ROMANCE	4.50
2	DOCUMENTAR	4.33
2	ADVENTURE	4.17
2	MYSTERY	4.00
2	COMEDY	4.00
2	ACTION	3.95
2	DRAMA	3.88
2	SCI-FI	3.88
2	CRIME	3.80
2	IMAX	3.75
2	THRILLER	3.70
2	WESTERN	3.50
2	HORROR	3.00

Enter User ID:
2
Show title
Movies watched
Genres watched
Genre ratings
Genre watch count
Favourite genre based on rating
Favourite genre based most viewed
Enter Movie ID:
Rating
Enter Movie's Name:
Watch count
Rating
Enter Genre Name:
Movie list
Enter Year:
Movie list
Enter n:
Top n Highest Rated Movies
Top n Most Watched Movies
Enter User1:
Enter User2:
Compare
Clustered Users according to taste (cluster baskets)
Clustered Users according to taste (UserID wise)
Movie recommendation

Figure 4 user id genre list sorted by highest ratings

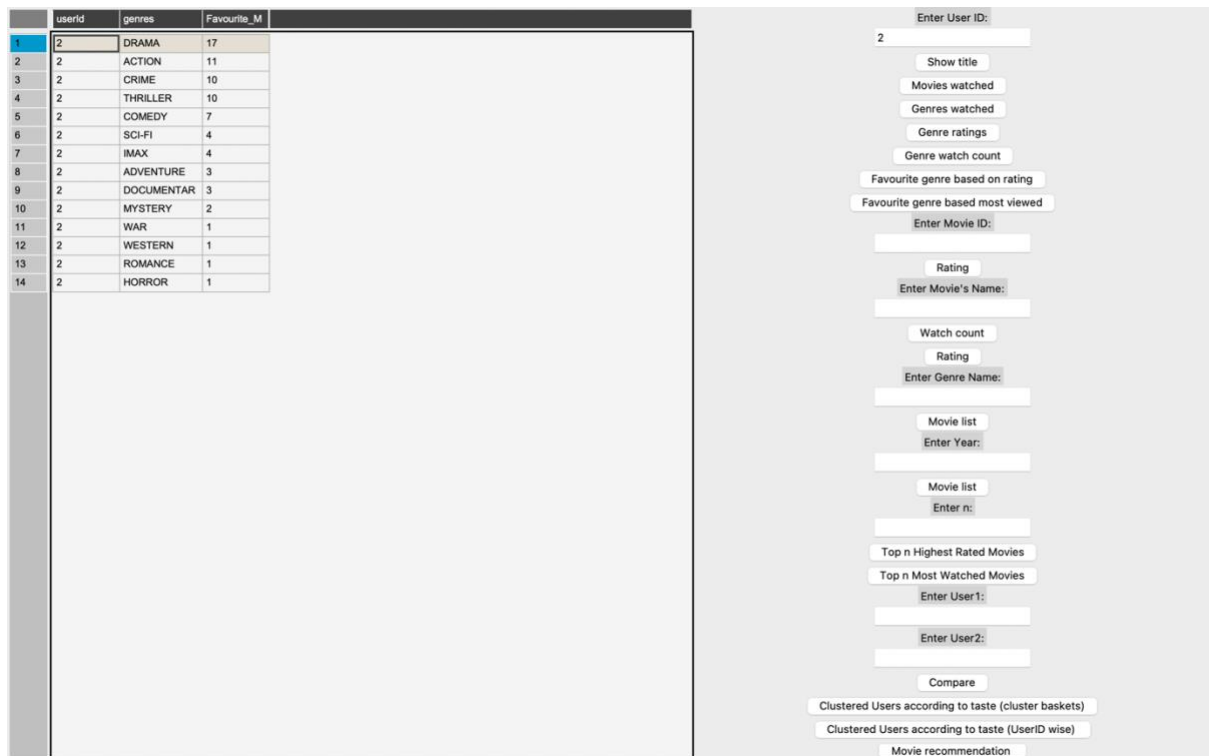


Figure 5 user id genre list sorted by most watched



Figure 6 movie ID watch count



Figure 7 movie Id rating

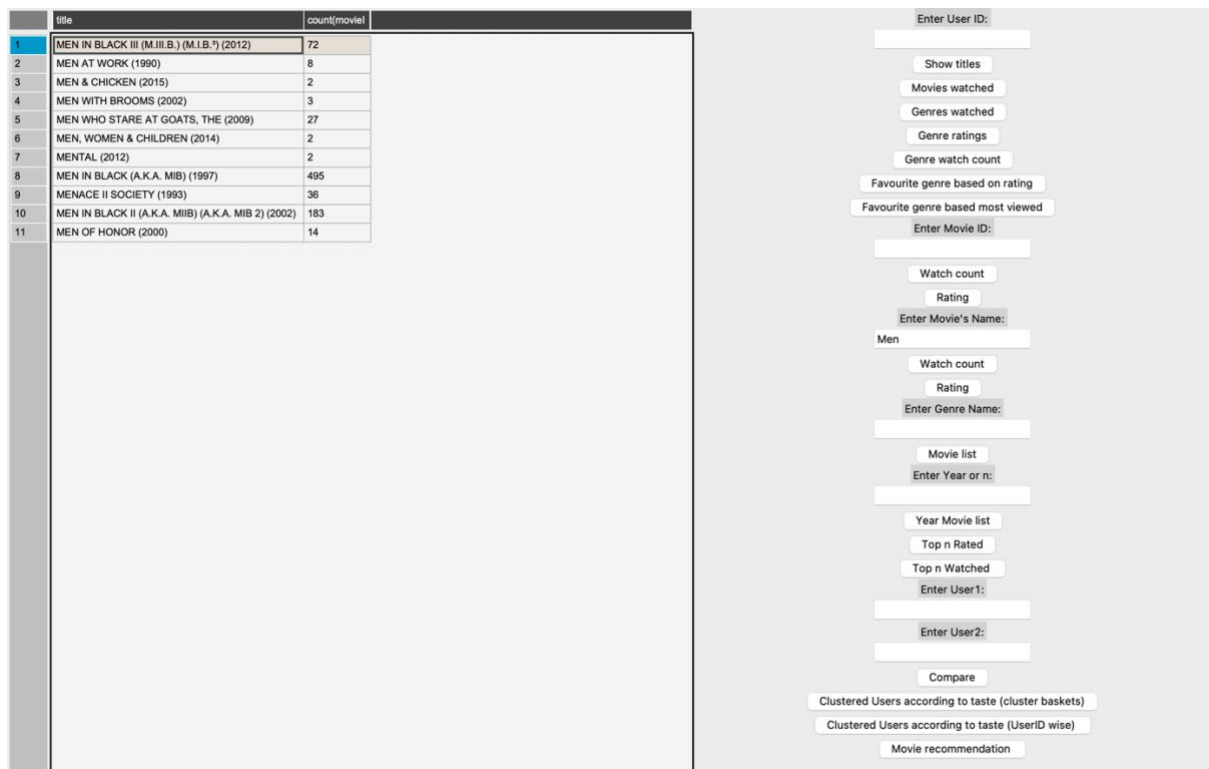


Figure 8 movie name watch count

	title	Avg Rating
1	MEN IN BLACK III (M.I.III.) (M.I.B.3) (2012)	3.28
2	MEN AT WORK (1990)	2.75
3	MEN & CHICKEN (2015)	4.00
4	MEN WITH BROOMS (2002)	4.00
5	MEN WHO STARE AT GOATS, THE (2009)	3.39
6	MEN, WOMEN & CHILDREN (2014)	2.00
7	MENTAL (2012)	2.00
8	MEN IN BLACK (A.K.A. MIB) (1997)	3.49
9	MENACE II SOCIETY (1993)	3.67
10	MEN IN BLACK II (A.K.A. MIB2) (A.K.A. MIB 2) (2002)	2.96
11	MEN OF HONOR (2000)	3.39

Enter User ID:

Show titles
Movies watched
Genres watched
Genre ratings
Genre watch count
Favourite genre based on rating
Favourite genre based most viewed
Enter Movie ID:

Watch count
Rating
Enter Movie's Name:
Men

Watch count
Rating
Enter Genre Name:

Movie list
Enter Year or n:

Year Movie list
Top n Rated
Top n Watched
Enter User1:

Enter User2:

Compare
Clustered Users according to taste (cluster baskets)
Clustered Users according to taste (UserID wise)
Movie recommendation

Figure 9 movie name rating

	title	genres
1	SOUTH PACIFIC (1958)	ROMANCE
2	MISÉRABLES, LES (2000)	ROMANCE
3	LEGALLY BLONDE (2001)	ROMANCE
4	MY SUPER EX-GIRLFRIEND (2006)	ROMANCE
5	WRISTCUTTERS: A LOVE STORY (2006)	ROMANCE
6	42ND STREET (1933)	ROMANCE
7	MUSIC FROM ANOTHER ROOM (1998)	ROMANCE
8	NINA TAKES A LOVER (1994)	ROMANCE
9	DANNY DECKCHAIR (2003)	ROMANCE
10	ALONG CAME POLLY (2004)	ROMANCE
11	CAN'T BUY ME LOVE (1987)	ROMANCE
12	JOE SOMEBODY (2001)	ROMANCE
13	JUST FRIENDS (2005)	ROMANCE
14	NEXT STOP WONDERLAND (1998)	ROMANCE
15	WIMBLEDON (2004)	ROMANCE
16	WHITE SUN OF THE DESERT, THE (BELOE SOLNTS)	ROMANCE
17	YOU ARE THE APPLE OF MY EYE (2011)	ROMANCE
18	SHAKESPEARE IN LOVE (1998)	ROMANCE
19	GOOD WILL HUNTING (1997)	ROMANCE
20	MODERN TIMES (1936)	ROMANCE
21	MULAN (1998)	ROMANCE
22	INDOCHINE (1992)	ROMANCE
23	REMAINS OF THE DAY, THE (1993)	ROMANCE
24	NOBODY'S FOOL (1994)	ROMANCE
25	MOGAMBO (1953)	ROMANCE
26	DAYS OF THUNDER (1990)	ROMANCE
27	LITTLE WOMEN (1933)	ROMANCE
28	WHAT DREAMS MAY COME (1998)	ROMANCE
29	ADAM AND EVE (NATIONAL LAMPOON'S ADAM & EV)	ROMANCE
30	BIG EDEN (2000)	ROMANCE
31	MY FAIR LADY (1964)	ROMANCE
32	LADYHAWKE (1985)	ROMANCE
33	GET OVER IT (2001)	ROMANCE
34	HAMLET (1996)	ROMANCE
35	MR. WONDERFUL (1993)	ROMANCE
36	CARRY ON CABBY (1963)	ROMANCE
37	BRIEF ENCOUNTER (1946)	ROMANCE
38	BARAN (2001)	ROMANCE
39	FEVER PITCH (2005)	ROMANCE

Enter User ID:

Show titles
Movies watched
Genres watched
Genre ratings
Genre watch count
Favourite genre based on rating
Favourite genre based most viewed
Enter Movie ID:

Watch count
Rating
Enter Movie's Name:

Watch count
Rating
Enter Genre Name:
rom

Movie list
Enter Year or n:

Year Movie list
Top n Rated
Top n Watched
Enter User1:

Enter User2:

Compare
Clustered Users according to taste (cluster baskets)
Clustered Users according to taste (UserID wise)
Movie recommendation

Figure 10 genre movie list search

	title
1	SPACE JAM (1996)
2	PRIMAL FEAR (1996)
3	GOTTI (1996)
4	BROKEN ARROW (1996)
5	JINGLE ALL THE WAY (1996)
6	MYSTERY SCIENCE THEATER 3000: THE MOVIE (1996)
7	MAXIMUM RISK (1996)
8	ERASER (1996)
9	OMEGA DOOM (1996)
10	SPACE JAM (1996)
11	HOUSE ARREST (1996)
12	BIG NIGHT (1996)
13	HIGH SCHOOL HIGH (1996)
14	BIO-DOME (1996)
15	GHOSTS OF MISSISSIPPI (1996)
16	FAN, THE (1996)
17	HAMLET (1996)
18	IN LOVE AND WAR (1996)
19	D3: THE MIGHTY DUCKS (1996)
20	FROM DUSK TILL DAWN (1996)
21	DRAGONHEART (1996)
22	BLOODSPORT 2 (A.K.A. BLOODSPORT II: THE NEXT
23	LONG KISS GOODNIGHT, THE (1996)
24	TIME TO KILL, A (1996)
25	HANDS ON A HARD BODY (1996)
26	KISSED (1996)
27	SOLO (1996)
28	ONE FINE DAY (1996)
29	HUSTLER WHITE (1996)
30	BLOOD AND WINE (BLOOD & WINE) (1996)
31	HOMEWARD BOUND II: LOST IN SAN FRANCISCO (1996)
32	SYDNEY (HARD EIGHT) (1996)
33	FARGO (1996)
34	SHE'S THE ONE (1996)
35	GLIMMER MAN, THE (1996)
36	EVITA (1996)
37	SUBSTITUTE, THE (1996)
38	JOE'S APARTMENT (1996)
39	DRAGON BALL: THE PATH TO POWER (DORAGON BÔ

Enter User ID:

Show titles
Movies watched
Genres watched
Genre ratings
Genre watch count
Favourite genre based on rating
Favourite genre based most viewed
Enter Movie ID:

Watch count
Rating
Enter Movie's Name:

Watch count
Rating
Enter Genre Name:

Movie list
Enter Year or n:
1996

Year Movie list
Top n Rated
Top n Watched
Enter User1:

Enter User2:

Compare

Clustering Users according to taste (cluster baskets)
Clustering Users according to taste (UserID wise)
Movie recommendation

Figure 11 year wise movie search

	movieid	title	avg_rating
1	1759	FOUR DAYS IN SEPTEMBER (O QUE É ISSO, COMP	5.00
2	136353	SCOOBY-DOO! AND THE LOCH NESS MONSTER (2	5.00
3	8238	LITTLE MURDERS (1971)	5.00
4	78836	ENTER THE VOID (2009)	5.00
5	5244	SHOGUN ASSASSIN (1980)	5.00
6	74226	DREAM OF LIGHT (A.K.A. QUINCE TREE SUN, THE)	5.00
7	112512	COLOURFUL (KARAFURU) (2010)	5.00
8	6835	ALIEN CONTAMINATION (1980)	5.00
9	170597	A PLASTICINE CROW (1981)	5.00
10	5723	CONTINENTAL DIVIDE (1981)	5.00

Enter User ID:

Show titles
Movies watched
Genres watched
Genre ratings
Genre watch count
Favourite genre based on rating
Favourite genre based most viewed
Enter Movie ID:

Watch count
Rating
Enter Movie's Name:

Watch count
Rating
Enter Genre Name:

Movie list
Enter Year or n:
10

Year Movie list
Top n Rated
Top n Watched
Enter User1:

Enter User2:

Compare

Clustering Users according to taste (cluster baskets)
Clustering Users according to taste (UserID wise)
Movie recommendation

Figure 12 Top n rated

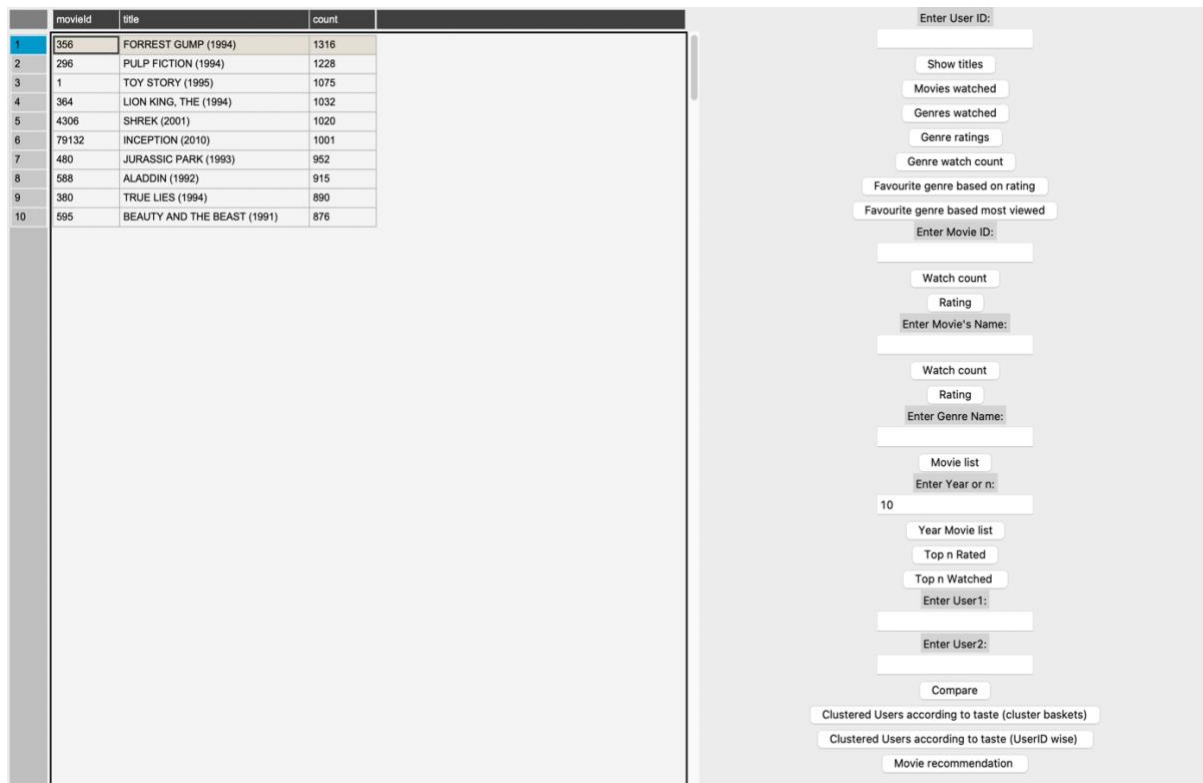


Figure 13 top n watched

Summary Part 2:

For this part, I implemented the Favourite genre based on ratings and Favourite genre based on most watched, by user Id (6 and 7 buttons in part 1).

I added the functionality to compare the taste of 2 users based on the genre ratings and number of movies watched from each genre.

Finally for part 2, I implemented K means clustering algorithm for clustering users according to their taste. To this end, taste is defined by the number of movies watched by the user from each genre. I decided on using the genre most watched by the user because of the abnormality of different genres available. For Example, Film Noir genre isn't a genre that has many movies, if a user has watched only one movie and liked it with a high rating, it would not reflect his real preference. I have added 2 buttons for viewing this:

1. Cluster basket view: which puts the user in cluster baskets or columns of their assigned cluster.
2. User Id view: that shows the user Id wise view of cluster.

	userid	genres	Favourite_Ra
1	2	WAR	4.50

Enter User ID:
2
Show title
Movies watched
Genres watched
Genre ratings
Genre watch count
Favourite genre based on rating
Favourite genre based most viewed
Enter Movie ID:
Rating
Enter Movie's Name:
Watch count
Rating
Enter Genre Name:
Movie list
Enter Year:
Movie list
Enter n:
Top n Highest Rated Movies
Top n Most Watched Movies
Enter User1:
Enter User2:
Compare
Clustered Users according to taste (cluster baskets)
Clustered Users according to taste (UserID wise)
Movie recommendation

Figure 14 favourite genre (rating based)

	userid	genres	Times_Watc
1	2	DRAMA	17

Enter User ID:
2
Show title
Movies watched
Genres watched
Genre ratings
Genre watch count
Favourite genre based on rating
Favourite genre based most viewed
Enter Movie ID:
Rating
Enter Movie's Name:
Watch count
Rating
Enter Genre Name:
Movie list
Enter Year:
Movie list
Enter n:
Top n Highest Rated Movies
Top n Most Watched Movies
Enter User1:
Enter User2:
Compare
Clustered Users according to taste (cluster baskets)
Clustered Users according to taste (UserID wise)
Movie recommendation

Figure 15 favourite genre (most viewed)

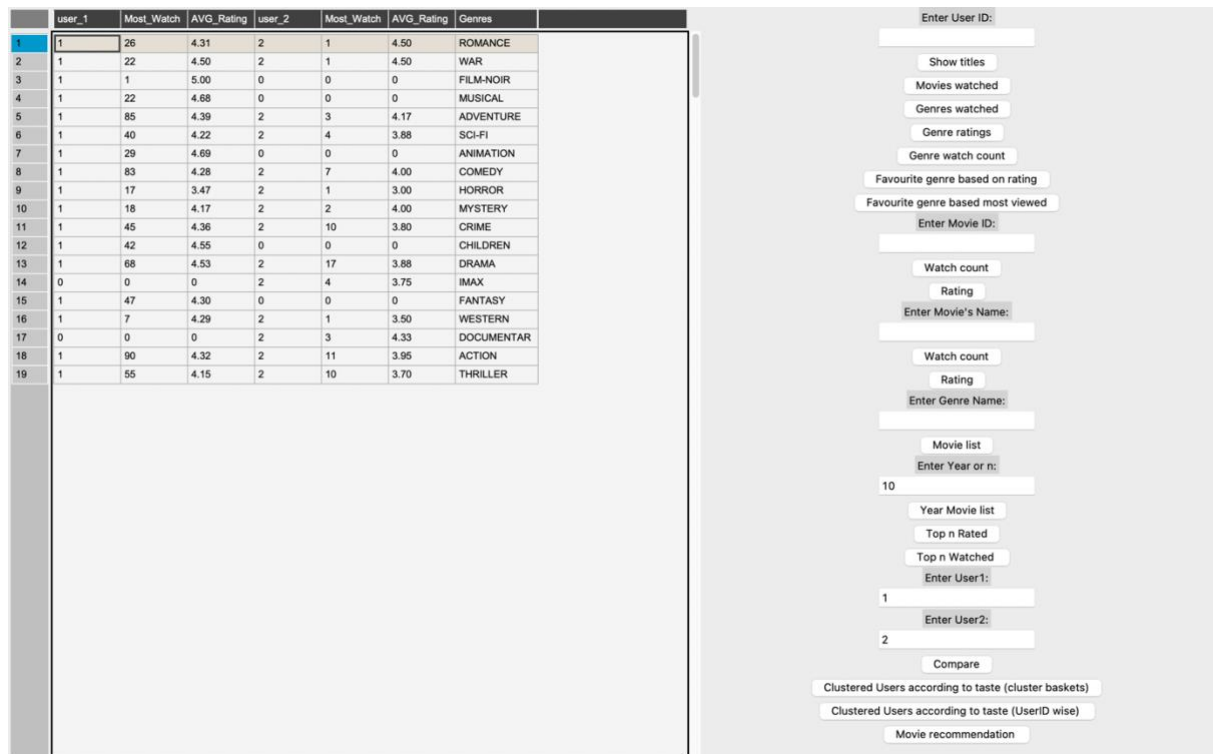


Figure 16 user comparison

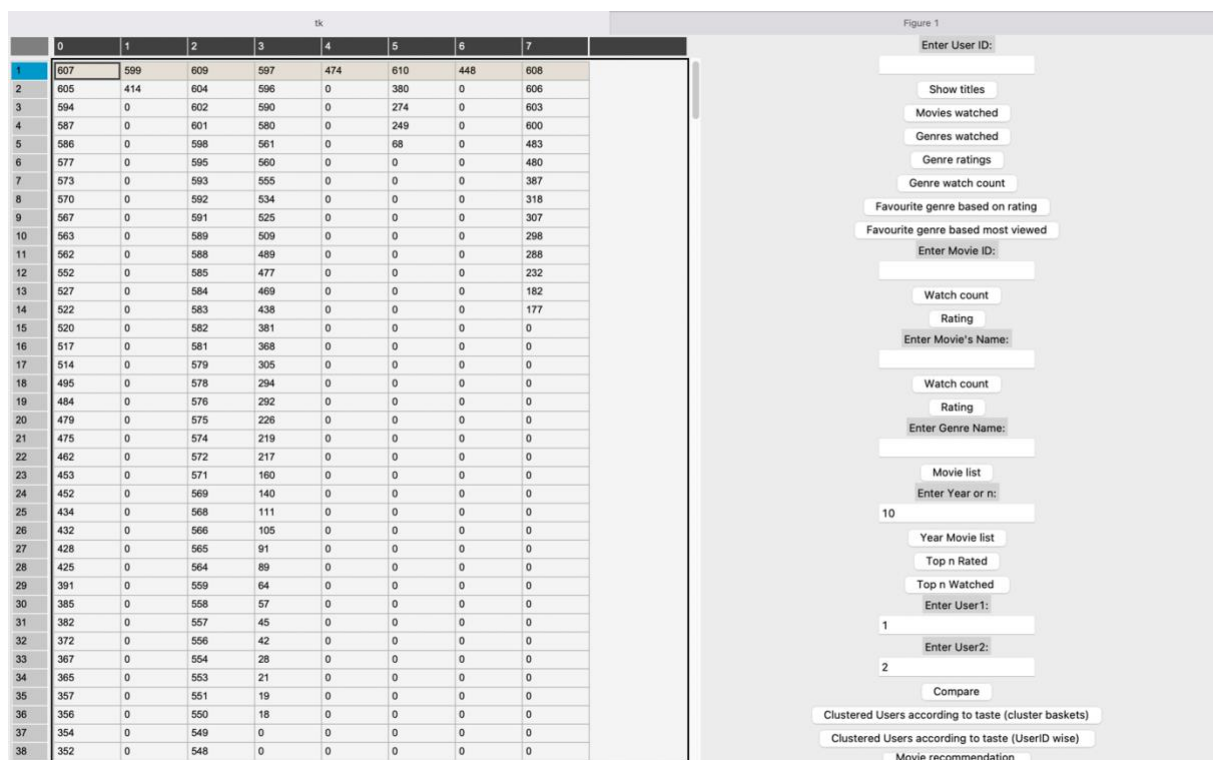


Figure 17 cluster basket view

Summary part 3:

For this part I have implemented the whole application with Pandas table, this gives a nice view of all the data. The other option was printing, which was untidy and difficult to interpret.

For the User cluster, I have provided the cluster assignment graph, this was done using ml.feature was used, function 'PCA'.

Lastly, I have added a movie recommendation system, which uses the rating given by the user to predict his preferences. To this end, pyspark's ml.recommendation was used with its function 'ALS'.

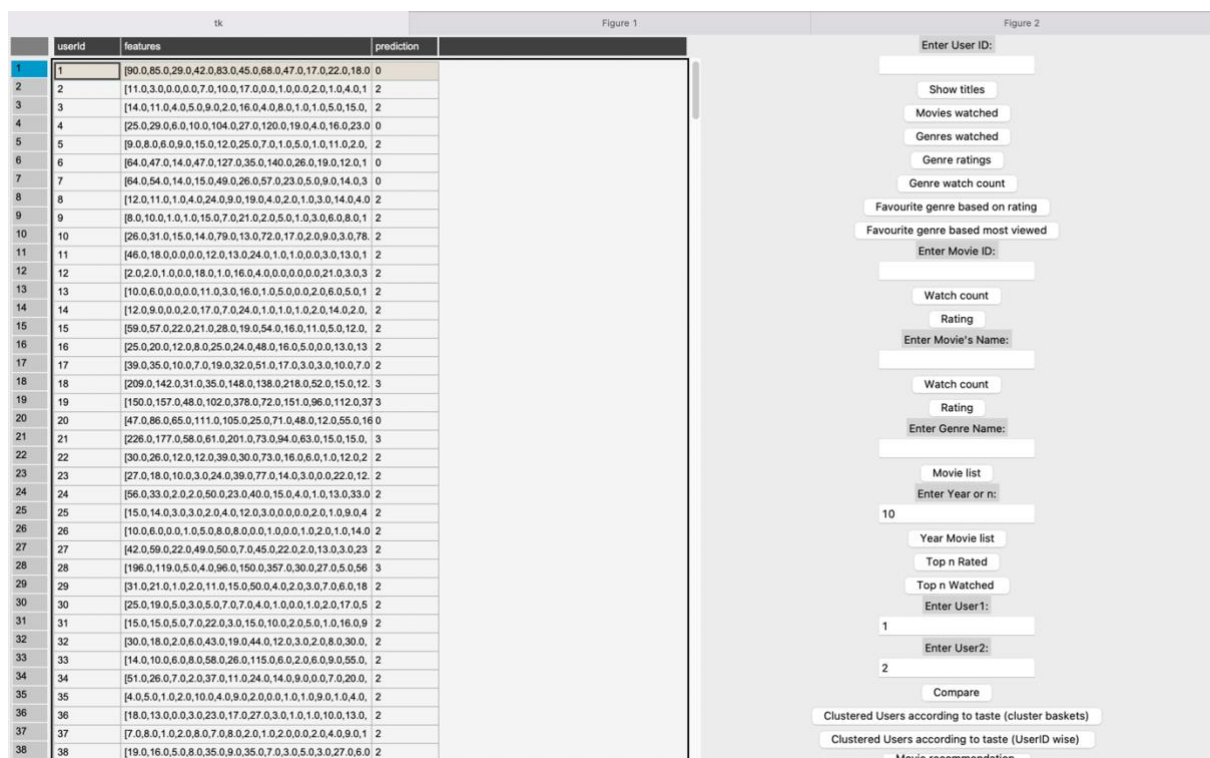


Figure 18 movie recommendation system

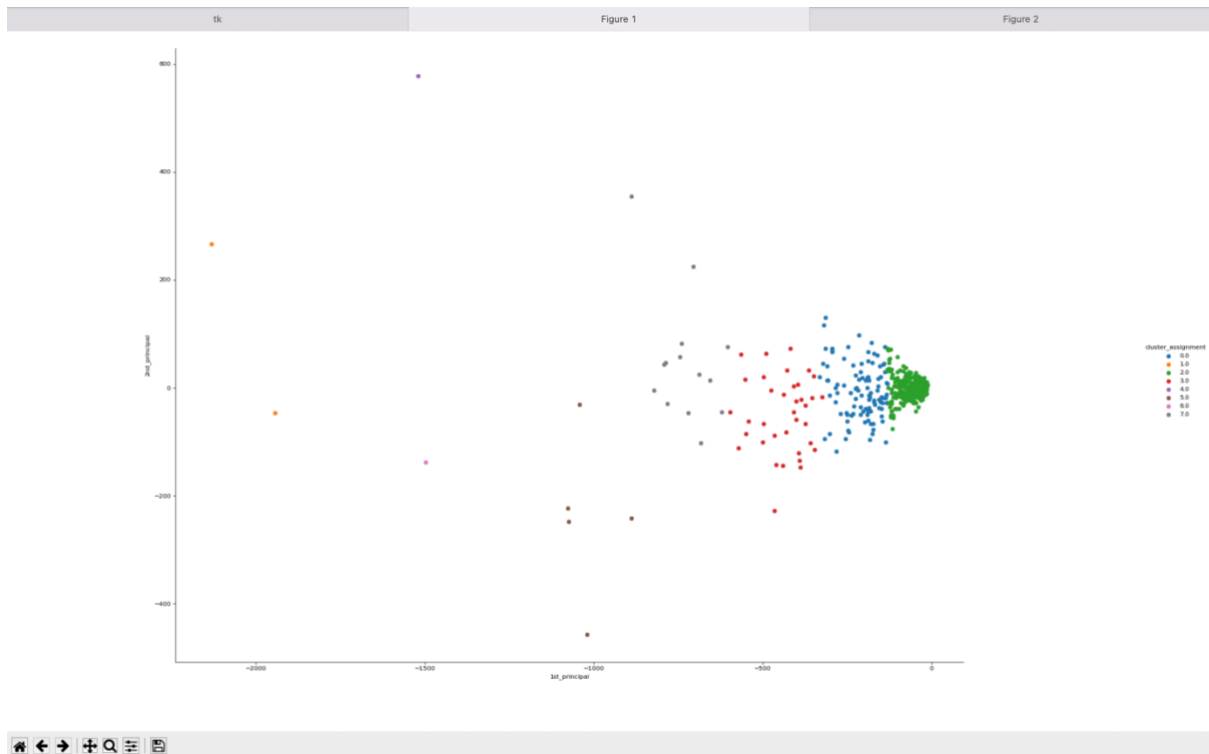


Figure 19 cluster graph visualization

Other effort:

I also implemented this program on a console, using spark submit. It was a fine application having a limitation that you can't have visualizations loaded onto it. I used a command that takes input in runtime, not possible with python's input command. But as mentioned before, the lack of visualizations forced me to switch to an application.

```
najmi — zsh — 80x24
najmi — python -cp ~/opt/anaconda3/envs/Py_R/lib/python3.7/site-...
| RUSH HOUR (1998)|
+-----+
only showing top 30 rows

Search by user ID ---> 0
Search by Title---> 1
Search by Genre ---> 2
Search by Year ---> 3
Search by Top Movies ---> 4
Search by Movie ID ---> 5
Compare 2 Users ---> 6
Clustered users by move taste ---> 7
0
0 ---> All data of a user
1 ---> movie list by user
2---> Total movies watched by a User
3---> Get Total genres watched by a user
4---> User's top rated genre
5---> Favourite genre by most viewed
1
Enter User ID
3
How many entries you want to see?
30
```

Figure 20 console app interface

```
najmi — python -cp ~/opt/anaconda3/envs/Py_R/lib/python3.7/site-...
|LIVE AND LET DIE ...|
|WOLF MAN, THE (1941)|
|GRUMPY OLD MEN (1...|
|GREEN MILE, THE (...|
| FIGHT CLUB (1999)|
| FRANKENSTEIN (1931)|
|ESCAPE TO WITCH M...|
|AUSTIN POWERS: IN...|
|HOWARD THE DUCK (...|
|E.T. THE EXTRA-TE...|
|HONEY, I SHRUNK T...|
| RUSH HOUR (1998)|
+-----+
only showing top 30 rows

Search by user ID ---> 0
Search by Title---> 1
earch by Genre ---> 2
Search by Year ---> 3
Search by Top Movies ---> 4
Search by Movie ID ---> 5
Compare 2 Users ---> 6
Clustered users by move taste ---> 7
```

Figure 21 some result