

# MovieLens Recommendation System

# What is Recommendation System?

- Makes recommendations to users based on their user information
- Benefits company and users
- Two types: Content Filtering & Collaborative Filtering



# Movielens Dataset

- Public dataset used for education purposes
- Subset of the full dataset

## movies.csv

9,000 movies

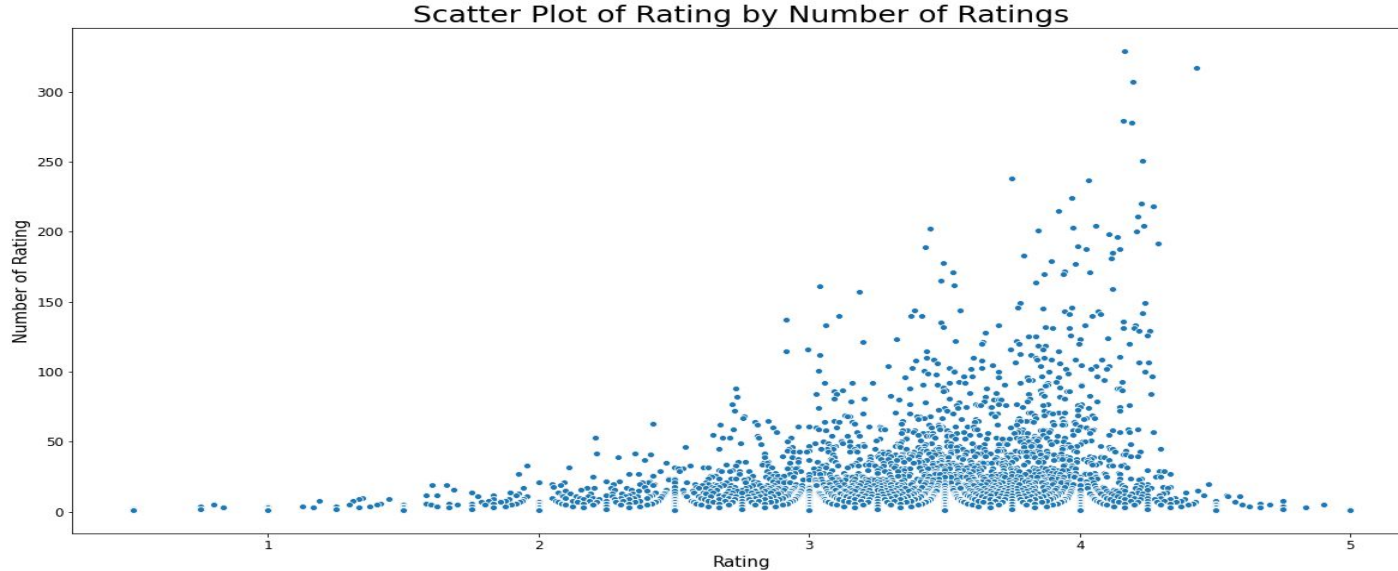
movieId		title	genres
0	1	Toy Story (1995)	Adventure Animation Children Comedy Fantasy
1	2	Jumanji (1995)	Adventure Children Fantasy
2	3	Grumpier Old Men (1995)	Comedy Romance
3	4	Waiting to Exhale (1995)	Comedy Drama Romance
4	5	Father of the Bride Part II (1995)	Comedy

## ratings.csv

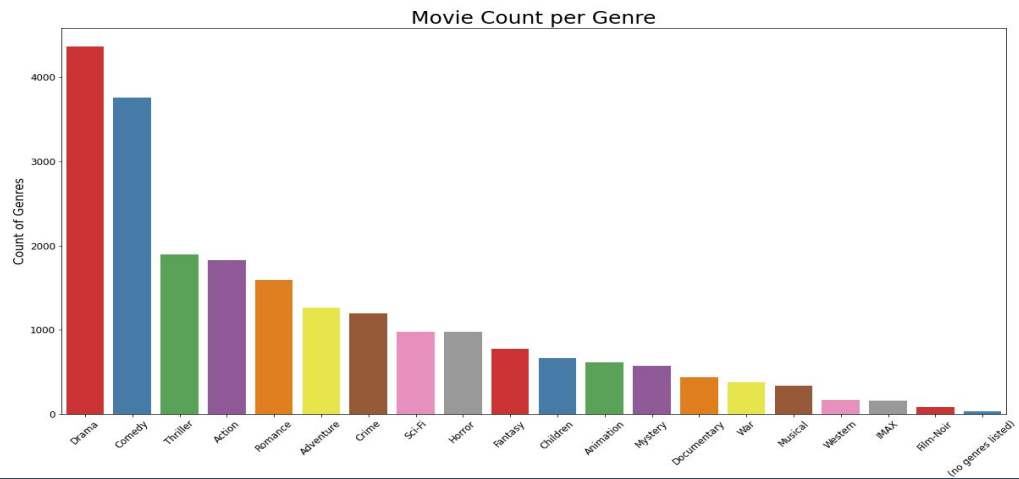
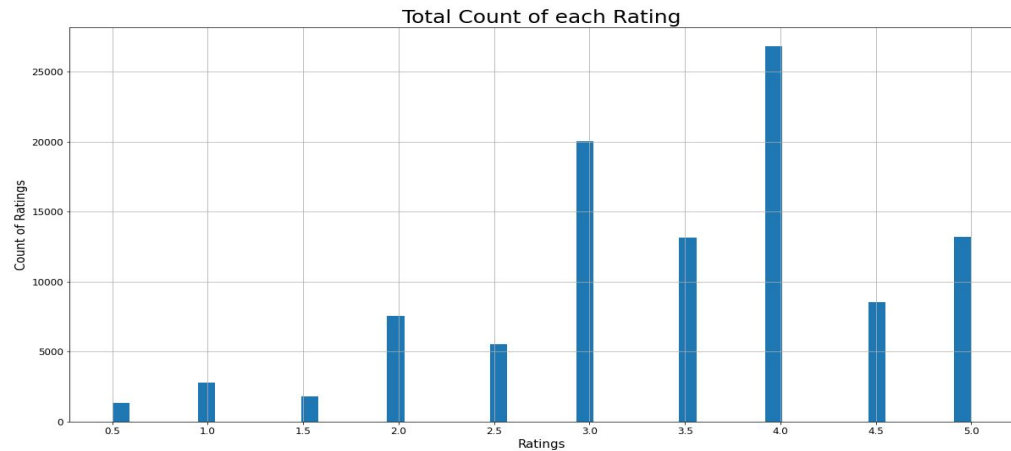
100,000 ratings, 600 users

	userId	movieId	rating	timestamp
0	1	1	4.0	964982703
1	1	3	4.0	964981247
2	1	6	4.0	964982224
3	1	47	5.0	964983815
4	1	50	5.0	964982931

# Analysis of Data



- Ratings of 1 and 5 have low number of ratings
- Average rating = 3.5, Std = 1.0



# Content Based Recommender System

- New user added to ratings data
- Find similar movies with the same movie genres
- Output movies with the highest weighted ratings for user

New User

	title	rating
0	Jumanji (1995)	3.0
1	No Game No Life: Zero (2017)	4.5
2	Grumpier Old Men (1995)	4.5



Recommended Movies

	movieid	title	weighted_ratings
0	84637	Gnomeo & Juliet (2011)	1.000000
1	56152	Enchanted (2007)	1.000000
2	4306	Shrek (2001)	1.000000
3	92348	Puss in Boots (Nagagutsu o haita neko) (1969)	1.000000
4	1064	Aladdin and the King of Thieves (1996)	0.904762

# Collaborative Filtering (Best Model)

	test_rmse	fit_time	test_time
Algorithm			
<b>SVDpp</b>	0.870703	431.107839	16.553896
<b>BaselineOnly</b>	0.876901	0.213474	0.267595
<b>SVD</b>	0.879918	5.074416	0.378455
<b>KNNBaseline</b>	0.882909	0.336863	3.794513
<b>KNNWithZScore</b>	0.905582	0.187470	3.363470
<b>KNNWithMeans</b>	0.905808	0.132291	3.089450
<b>SlopeOne</b>	0.912458	4.904305	12.645922
<b>NMF</b>	0.935876	5.739594	0.343495
<b>CoClustering</b>	0.955678	2.377111	0.335019
<b>KNNBasic</b>	0.956891	0.110424	2.879292
<b>NormalPredictor</b>	1.424418	0.175244	0.493909

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**Best Model (RMSE): BaselineOnly**

# Collaborative Based Recommender System (BaselineOnly)

- New user added to ratings data
- Neighborhood-based filtering
- Output movies with the highest similarities

New User

	userId	movieId	rating
0	1000	133712	5
1	1000	3773	4
2	1000	60904	5
3	1000	2385	2
4	1000	114818	1



Recommended Movies

Recommendation # 1 : 277 Name: title, dtype: object	Shawshank Redemption, The (1994)
Recommendation # 2 : 906 Name: title, dtype: object	Lawrence of Arabia (1962)
Recommendation # 3 : 602 Name: title, dtype: object	Dr. Strangelove or: How I Learned to Stop Worr...
Recommendation # 4 : 9618 Name: title, dtype: object	Three Billboards Outside Ebbing, Missouri (2017)
Recommendation # 5 : 841 Name: title, dtype: object	Streetcar Named Desire, A (1951)



# Future Work

## Full Dataset

- Full dataset contains more movies and ratings
- Improve model results

## Include Recent Data

- Include recent movies and ratings
- MovieLens last updated 9/2018



Thank you!