

A woman with dark hair and glasses is looking over the top of an open book. The background is a blurred library with bookshelves. The image has a blue tint and a semi-transparent orange rectangle is overlaid on the bottom half.

Book Recommendation System

DSI14 Capstone
Jocelyn Pok

01

Use Cases

Pervasiveness of recommendation systems

02

Problem Statement

Independent retailers:
adapting to changing retail
landscape and external
events

03

Exploratory Data Analysis

Insights from the datasets

04

Models & Evaluation

Content-based, Collaborative
filtering and Hybrid
techniques

05

Conclusion

Limitations and future
considerations

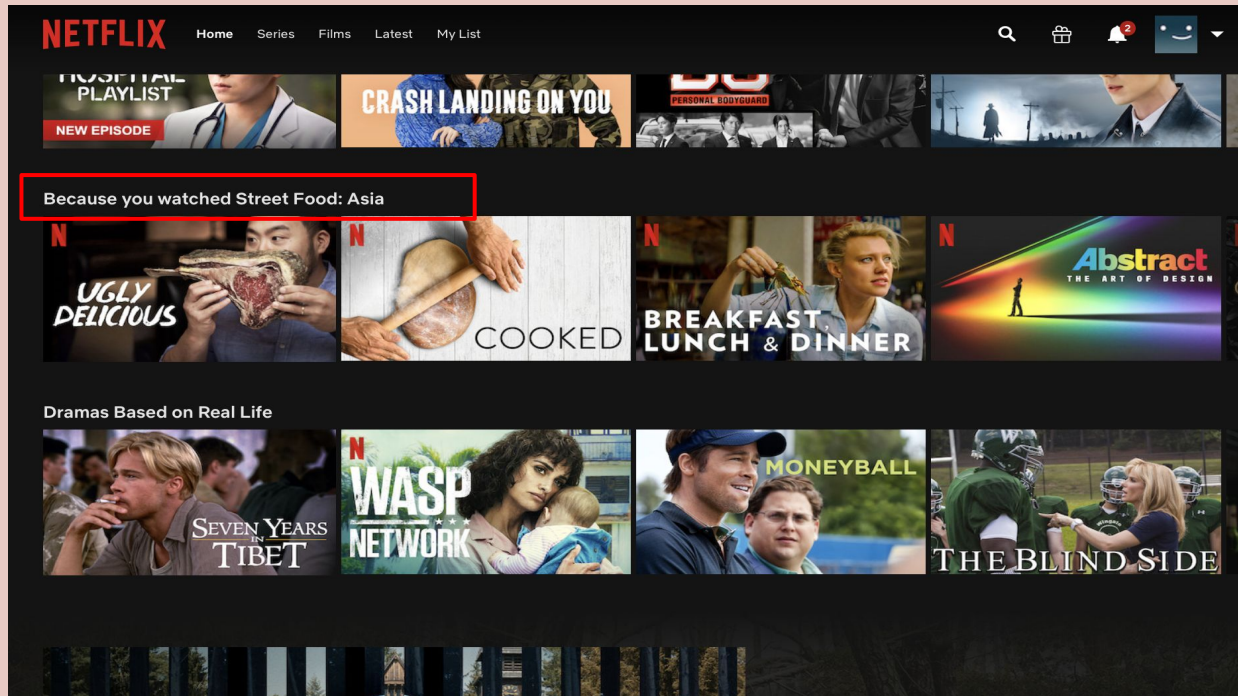
06

Demo

Table of Contents

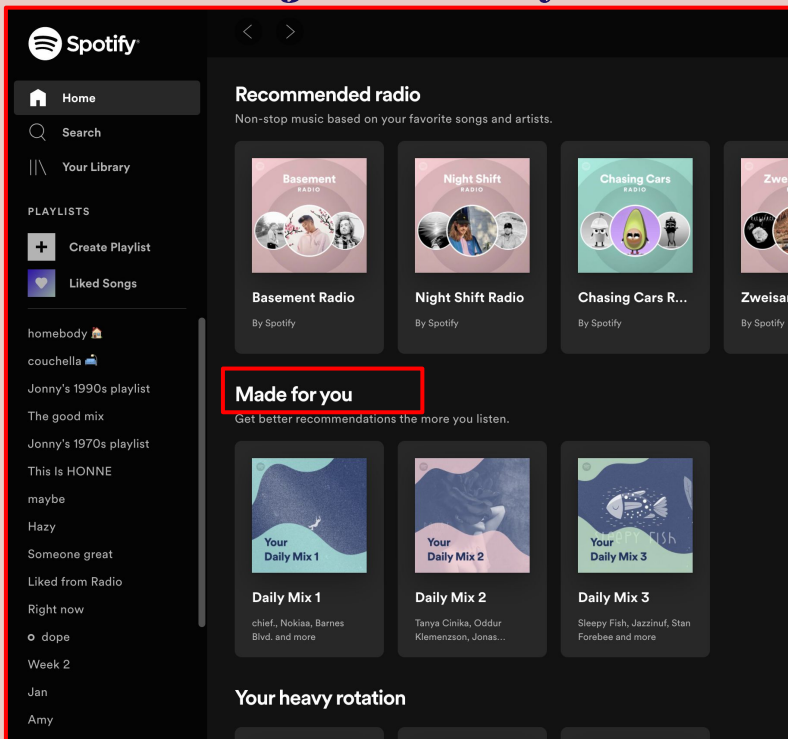
Use case 1 : User-item

“ Recommended just for you”



Use case 1 : User-item

“ Recommended just for you”





Use case 2 : Item-item

“ Similar products...”


Customers who viewed this item also viewed

Page 1 of 1







Nintendo Switch Lite - Gray
★★★★★ 10,025
124 offers from \$229.99




Nintendo Switch – Neon Red and Neon Blue Joy-Con - HAC 001...
Nintendo
★★★★★ 14,948
Nintendo Switch
32 offers from \$409.99




Nintendo Switch with Neon Blue and Neon Red Joy-Con HAC-001 w...
Nintendo
★★★★★ 1,322
Nintendo Switch
26 offers from \$549.96



Nintendo Switch Console Bundle- Pikachu & Eevee Edition with Pokemon...
Nintendo
★★★★★ 661
Nintendo Switch
33 offers from \$603.98



Nintendo Switch - Animal Crossing: New Horizons Edition - Switch
Nintendo
★★★★★ 643
Nintendo Switch
23 offers from \$696.96



Amazon

According to Mckinsey & Company, 35% of Amazon's revenue is generated by its recommendation engine

Netflix

According to Mckinsey & Company, 75% of what users watch on Netflix come from product recommendations

Spotify

Possibly one of Spotify's most innovative uses of AI and recommendation systems is their popular Discover Weekly playlist. Known as Release Radar, this algorithmically powered tool updates personal playlists on a weekly basis so that users won't miss newly released music by artists they like.

The new recommendation system has helped Spotify increase its number of monthly users from 75 million to 100 million at a time, in spite of competition from rival streaming service Apple Music.

Situation

The New York Times

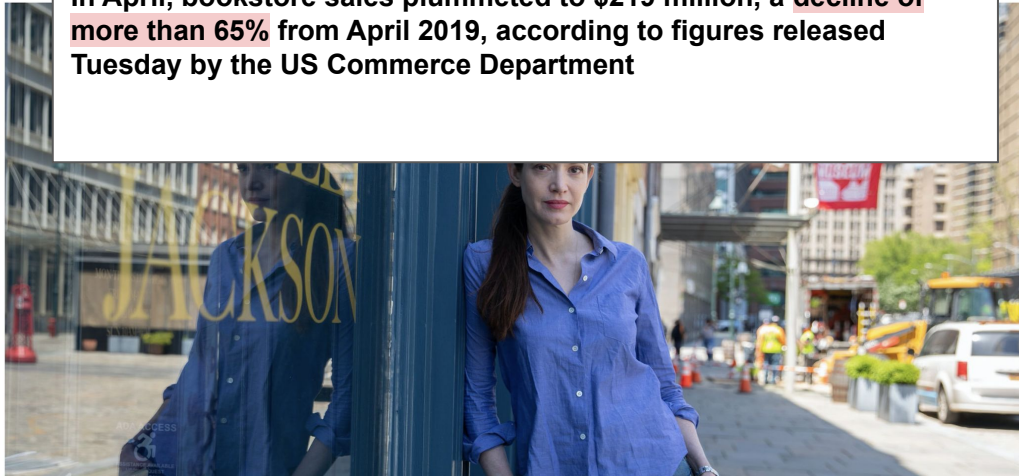
SUBSCRIBE NOW

Opinion

What Could Kill My New York Bookstores?

It won't be Amazon or the coronavirus. It will be artificially high rents.

In April, bookstore sales plummeted to \$219 million, a decline of more than 65% from April 2019, according to figures released Tuesday by the US Commerce Department



Problem Statement

“COVID-19 is not only a public health issue. It is also a serious economic, social and political problem” -PM Lee

Beyond the pandemic, independent bookstores that have joined the online retail ecosystem can explore implementing recommendation systems that can significantly boost sales and positive effects on the user experience as well, which translates into metrics that are of much importance to online businesses such as customer satisfaction and retention.

This project seeks to identify the best recommendation model that obtains the best top-N accuracy metrics for the dataset. The methods that will be explored in this project include : content-based, collaborative filtering and hybrid



Data

Amazon Review dataset

- 1,212,723 reviews
- Overall rating, review text, asin of the book and the datetime at which the review was written
- In cases where a unique user would rate one book several times throughout his/her history, only the most recent review is kept since it reflects the user's latest preference

Amazon Book metadata

- 17,932 books
- Description, title, asin of the book and the categories assigned to the book
- Books with no descriptions were dropped



Exploratory Data Analysis

Lorem ipsum dolor sit amet consectetur
adipiscing elit massa sociis mollis iaculis,
arcu fermentum per ullamcorper id at tempor
turpis volutpat curae, quisque vitae montes
magna sodales purus fringilla mattis sem nunc.
Elementum tempor scelerisque metus hac lacus,
sem rhoncus consequat mollis turpis porta,
vivamus bibendum porttitor suscipit.

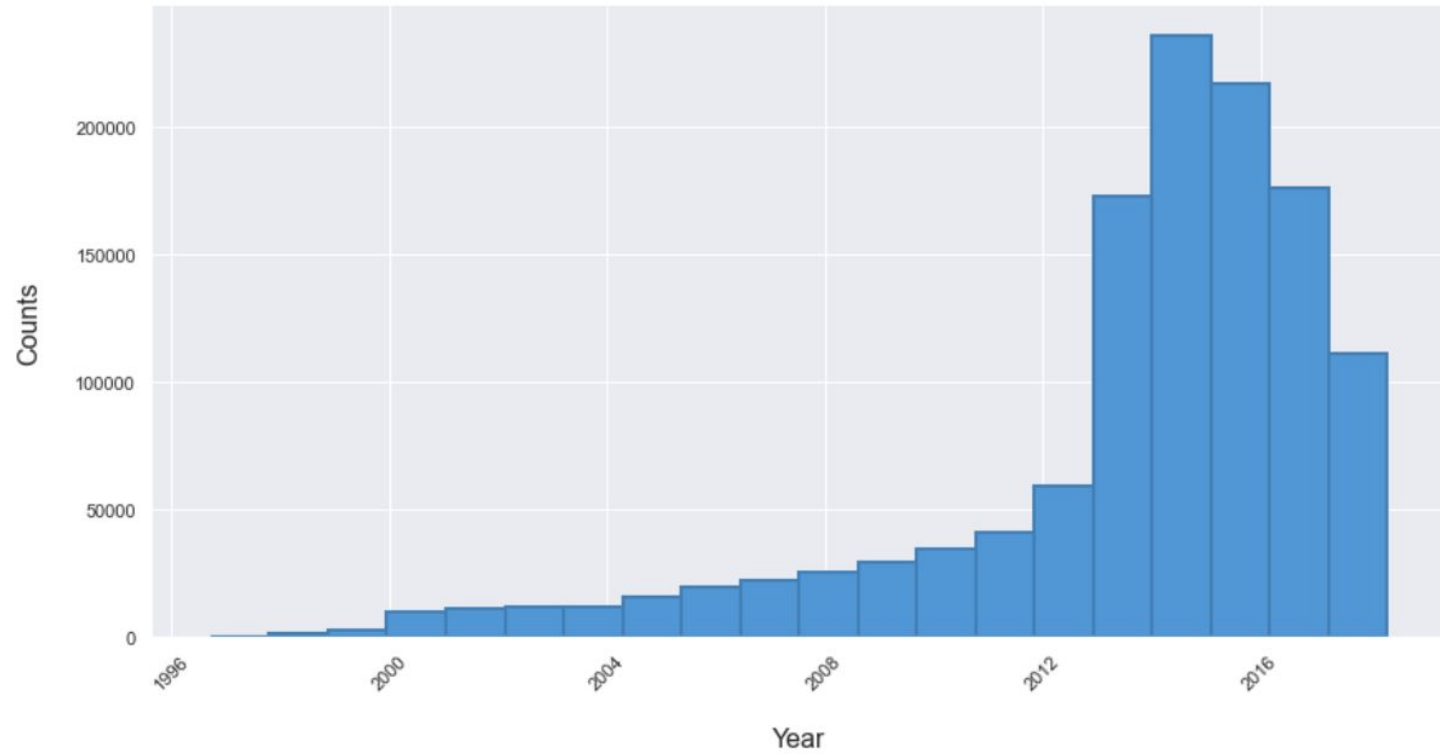
Tristique curae mollis porta sed fusce tempor
lacus est mus magna iaculis, eu ultricies
aliquet aptent diam accumsan varius auctor non.
Dapibus purus varius potenti sociosqu pulvinar
quis ut sagittis, per turpis fermentum litora
magnis class tincidunt, faucibus auctor
tristique inceptos erat vehicula eu. Platea
metus auctor blandit id cubilia dapibus
parturient dictum risus volutpat, rhoncus
tristique bibendum praesent laoreet nulla
ornare pharetra sociosqu penatibus, gravida mi
aliquam malesuada condimentum eu imperdiet at
nam.

Tristique curae mollis porta sed fusce tempor
lacus est mus magna iaculis, eu ultricies
aliquet aptent diam accumsan varius auctor non.
Dapibus purus varius potenti sociosqu pulvinar
quis ut sagittis, per turpis fermentum litora
magnis class tincidunt, faucibus auctor
tristique inceptos erat vehicula eu. Platea
tristique inceptos erat vehicula eu. Platea
metus auctor blandit id cubilia dapibus
parturient dictum risus volutpat, rhoncus
accumsan varius auctor non. Dapibus purus
accumsan varius auctor quis ut
varius potenti sociosqu pulvinar litora magnis
sagittis, per turpis fermentum litora magnis
class tincidunt, faucibus auctor tristique
inceptos erat vehicula eu. Platea metus auctor
blandit id cubilia dapibus parturient dictum
inceptos erat vehicula eu. Platea metus auctor
risus volutpat, rhoncus tristique
praesent laoreetvolutpat, rhoncus tristique
bibendum praesent laoreet nulla ornare pharetra
sociosqu penatibus, gravida mi aliquam
malesuada condimentum eu imperdiet at nam.

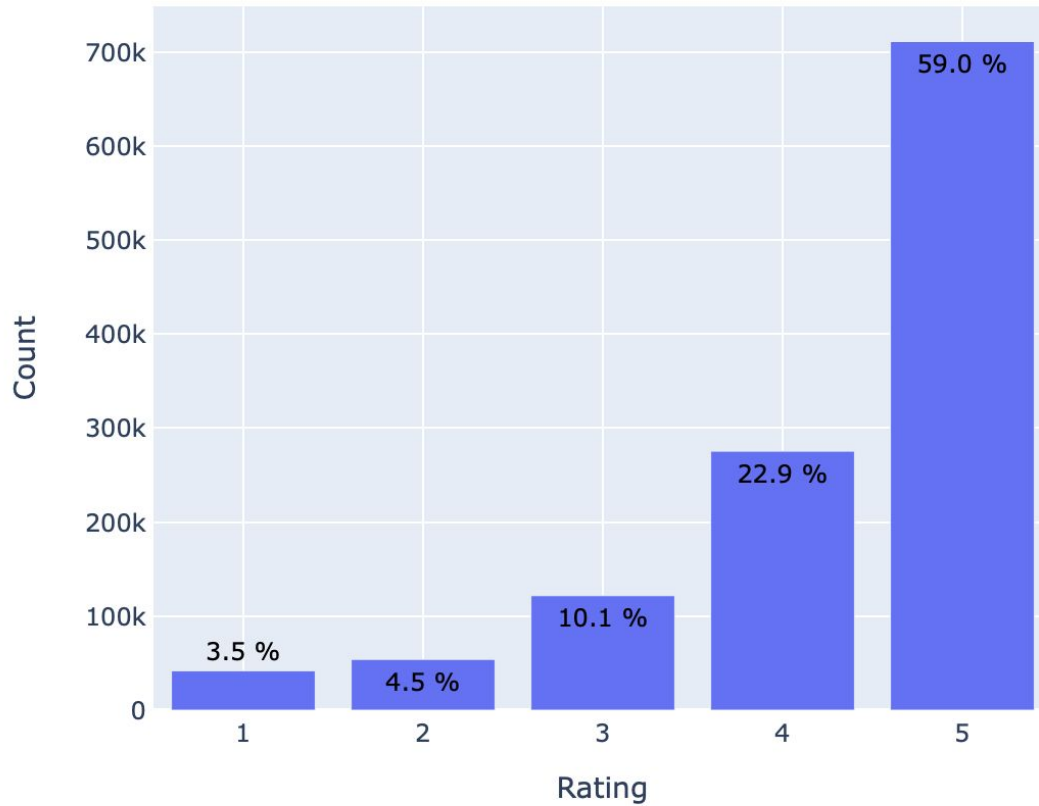
Lorem ipsum dolor sit amet consectetur
adipiscing elit massa sociis mollis iaculis,
arcu fermentum per ullamcorper id at tempor
turpis volutpat curae, quisque vitae montes
magna sodales purus fringilla mattis sem nunc.
Elementum tempor scelerisque metus hac lacus,
sem rhoncus consequat mollis turpis porta,
vivamus bibendum porttitor suscipit.

Tristique curae mollis porta sed fusce tempor
lacus est mus magna iaculis, eu ultricies
aliquet aptent diam accumsan varius auctor non.
Dapibus purus varius potenti sociosqu pulvinar
quis ut sagittis, per turpis fermentum litora
magnis class tincidunt, faucibus auctor
tristique inceptos erat vehicula eu. Platea
metus auctor blandit id cubilia dapibus
parturient dictum risus volutpat, rhoncus
tristique bibendum praesent laoreet nulla
ornare pharetra sociosqu penatibus, gravida mi
aliquam malesuada condimentum eu imperdiet at
nam.

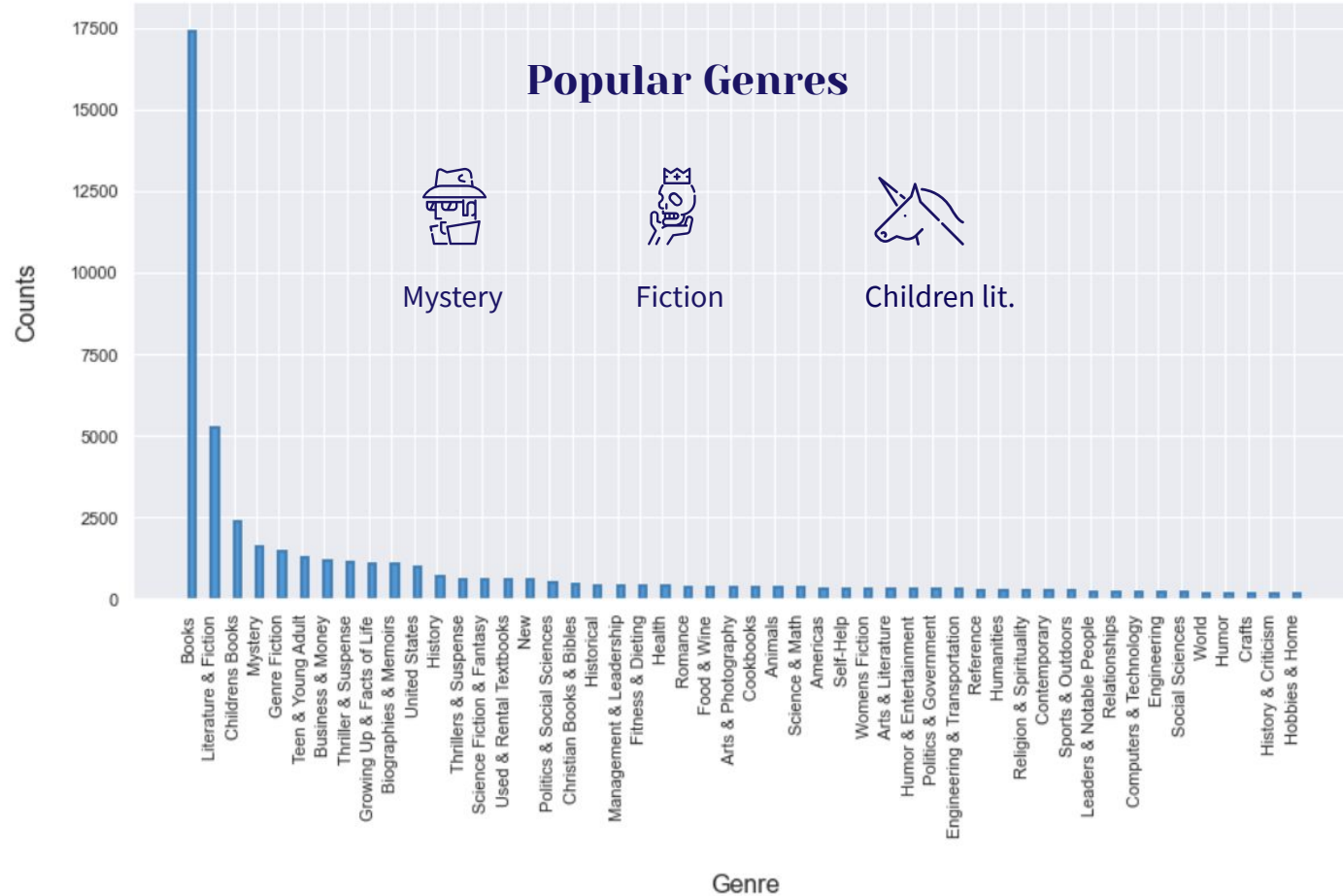
Reviews per year



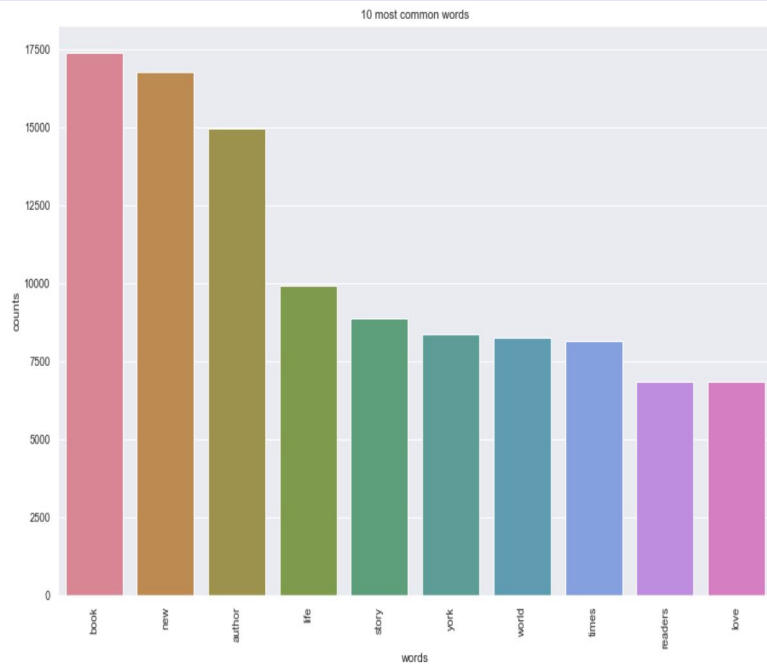
Distribution Of 1204430 book-ratings



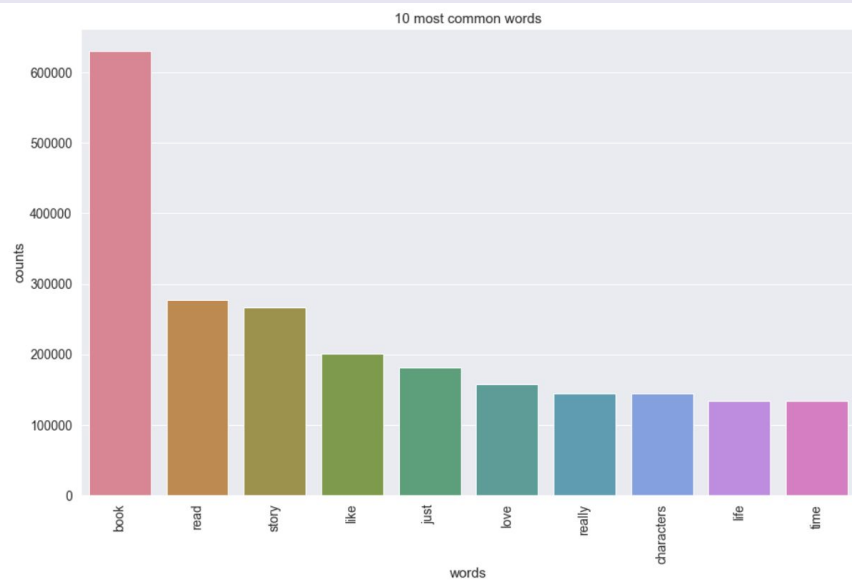
Most Popular Book Genres



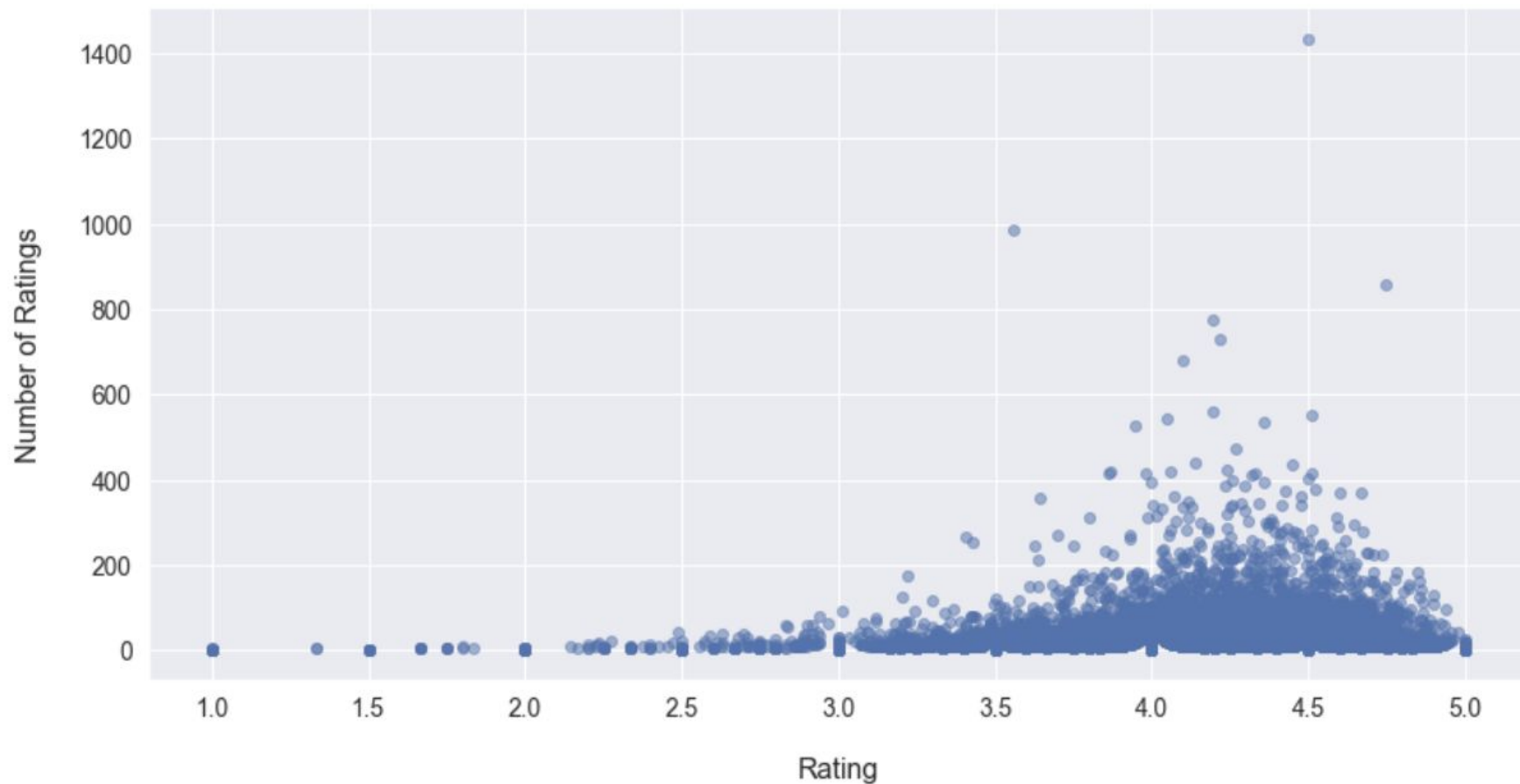
Description



Reviews



Rating vs. Number of Ratings



Model fit and Evaluation



Measure model performance

Top N-accuracy

- Users are provided with a ranked list of N items they will be interested in, in order to encourage views and purchase

Recall@N

- $\text{Hit@N count} / \text{total interacted items in test set}$

Hit Rate

- To evaluate the top-N recommendations, if the user has rated one of the top-N recommended items, it is considered a “hit”

Baseline Approach

“In the recommendations world, there’s a cardinal rule. If i know nothing about you, then the best things to recommend to you are the most popular things in the world”

- Vijai Mohan, Senior Applied Scientist, Personalization Team of Amazon

Which model to use?

Recommendation algorithms

Collaborative filtering

- Matrix completion
- User/Item similarity

Content-based Models

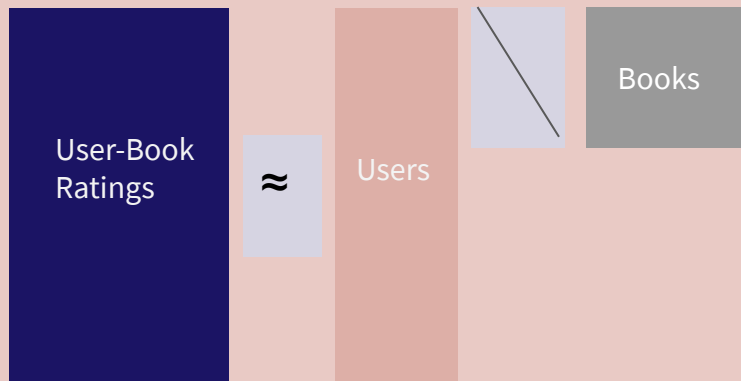
- Match based on user and book features

Hybrid Models

Modelling

Recommendation Algorithms

Collaborative Filtering



- Singular Value Decomposition(SVD)
- Decomposes user-book interactions matrix into a set of user and book vectors
- Use vectors to estimate user responses to unseen items

Content-based Models



Extract features out of the book description to create useful representations

$$\begin{array}{|c|} \hline \text{Value of} \\ \text{"Crime"} \\ \text{to description for} \\ \text{"Mystery"} \\ \hline \end{array} = \begin{array}{|c|} \hline \text{Frequency} \\ \text{of "Crime" in} \\ \text{description} \\ \hline \end{array} \times \begin{array}{|c|} \hline \text{Inverse Freq} \\ \text{of "Crime" in} \\ \text{all} \\ \text{documents} \\ \hline \end{array}$$

- Vector for each document is represented as the computed TF-IDF weights
- Find similar books by comparing their word vector

Comparison of methods

	recall@5	recall@10
modelName		
Popularity	0.413076	0.542086
Collaborative Filtering	0.576140	0.710156
Content-Based	0.898594	0.911581
Hybrid	0.542114	0.542443



05

Business Recommendations

Your subtitle goes here

The content-based method is well-suited for businesses new to the realm of recommendation systems but seek to incorporate an element of personalization. By identifying user's specific tastes and then provide them with relevant products will enhance the user's experience.

Limitations

A content-based system is limited by the novelty in recommended results. Because it only looks at user's past history, it never jumps to other areas that users might like but never interacted before. Additionally, if the quality of the content does not contain enough information to discriminate the items precisely, this method will perform poorly



Looking forward

Explore

- More complex representations of data(eg word embeddings)
- Deep learning: Neural network architectures for collaborative filtering can be explored.

Deployment

- **A/B testing**: Assign users to treatment(new model) and control(existing) groups.
- Evaluate outcomes; CTR ,sales of the books
- Complex models with lots of data take a long time to train
- Do **scheduled** batch prediction
- Save results to **in-memory datastores** for fast retrieval(Redis, Memcached)
- Enable **autoscaling** on API servers



Demo



Thanks



CREDITS: This presentation template was created by Slidesgo, including icons by Flaticon, and infographics & images by Freepik.

Please keep this slide for attribution.

