

DS L&L Series Lesson 2
Feb 1, 2019

Data Science: Case Studies and Code

3 Questions about Products



1. What to recommend to customers?



2. What do customers think of the products?



3. What if we let customers try them first?

1. What to recommend to customers?

Recommending products to shoppers: Why?



Upsell



Cross sell



Delight them



Make them spend more money!

So how do we
recommend
products?

Most basic is a
popularity model

Most common is
a *collaborative
filtering* model

Popularity model: AI or marketing hype?

Amazon.com: Kodak Cameras [Newsletters](#) [X](#)

★ [Amazon.com](#) to me [show details](#) Jun 2 (6 days ago) [Reply](#) ▼



Customers who have shown an interest in point-and-shoot cameras might like to take a look at this week's bestselling products from Kodak.



[Kodak EasyShare C143 Digital Camera \(Blue\)](#)


[Kodak EasyShare C143 12 MP Digital Camera with 3X Optical Zoom and 2.7-Inch LCD \(Silver\)](#)

[Kodak EasyShare C195 Digital Camera \(Purple\)](#)

[Kodak EasyShare Sport C123 12 MP Waterproof Digital Camera with 2.4-Inch LCD - Blue \(New Model\)](#)

Collaborative Filtering

Item based:
X is like Y, based on some
measurement and representation
of the products



User-item based:
I like this, you like that, we're alike,
so I must like that

Let's dive
into the
algorithms!



Amazon's (Patented) Item-Item CF: Patented, but not machine learning

Recommended for You Based on Kindle Paperwhite, 6" High Resolution Display w...

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MoKo Case for Kindle Paperwhite, Premium Thinnest and Lightest Leather Cover with...

★★★★★ 898

\$9.99 ✓Prime



Sweets Ultra Slim Leather Case Cover for Amazon All-New Kindle Paperwhite (Both 2012...

★★★★★ 273

\$3.99 ✓Prime



Fintie SmartShell Case for Kindle Paperwhite - The Thinnest and Lightest Leather Cover for...

★★★★★ 7,015

\$14.99 ✓Prime



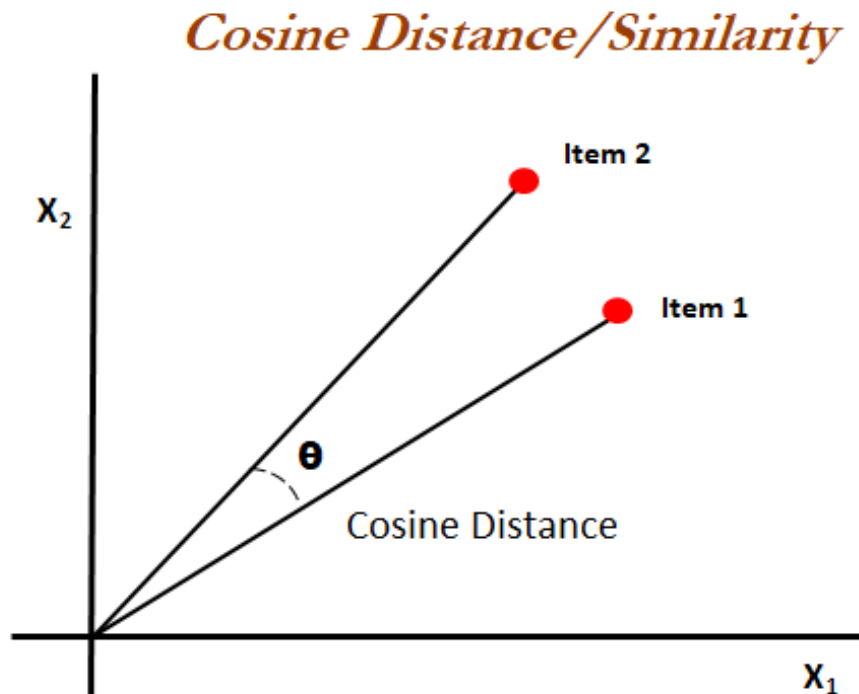
Kindle Paperwhite, 6" High Resolution Display (212 ppi) with Built-in Light, Free 3G...

★★★★★ 45,265

\$159.99 ✓Prime



Item-based collaborative filtering



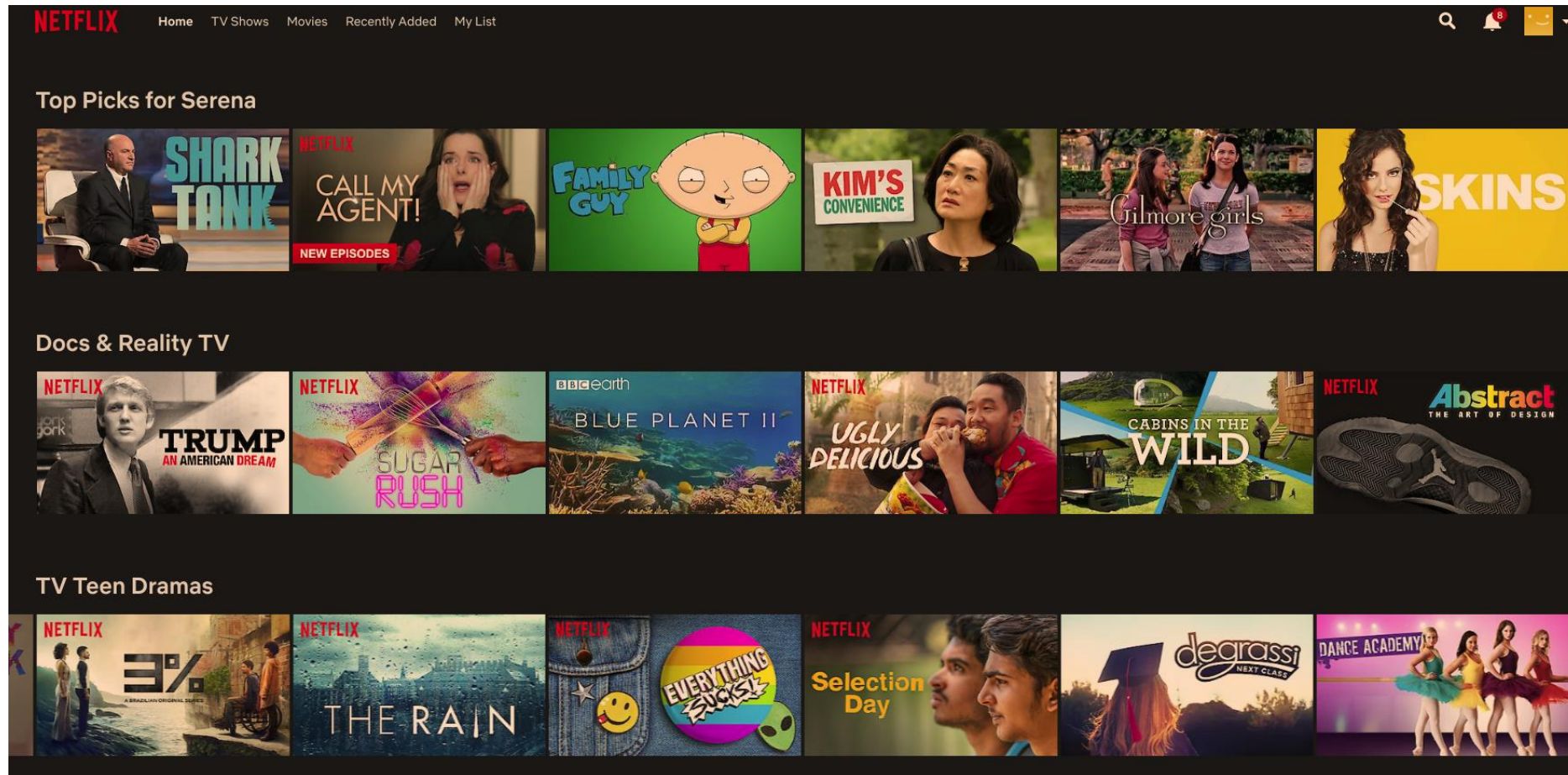
- Steps in the algorithm:
 - 1. Define vector representation of the product
 - 2. For all product pairs, compute cosine similarity between the two
- The higher the score, the more similar the product



But how do we implement this?

[Item-item similarity Python code](#)

Netflix's Model: User-item CF. ML!



User-item collaborative filtering

- Represent user and movie ratings in a user-item matrix
- Fill in unknown ratings then give recommendations
- Need to decompose the matrix
- Simple method is singular value decomposition

| |  |  |  |  |
|---|---|---|---|---|
| John  | 5 | 1 | 3 | 5 |
| Tom  | ? | ? | ? | 2 |
| Alice  | 4 | ? | 3 | ? |



And how do we implement *this*?

[User-item collaborative filtering](#)

2. What do customers think of the products? How do they *feel*?

How do customers like our products? What do our employees think of us? Why do we care?



Directly get feedback on our company/products



Could help for marketing purposes



Too much content to look at ourselves, so automate it with machine learning

Sentiment analysis



Paige @PaigeAHawk · 5 Jan 2013

Who needs a boyfriend when you work at Weis ALL THE TIME?
[#weismarkets](#) [#cashierproblems](#) [#hahahahahaha](#)



2



@ @albar__ · 7 Dec 2012

Ready for a completely exciting night at [#weismarkets](#) stocking shelves... [#ha](#)
[#whoamikidding](#)



1



Katja @katjamandl · 28 Feb 2015

"Do you want the phone number" "Jesus Christ I can't live this life" "you ready?
838..." "HOLY HELL" [#WeisMarkets](#) @kelday21



2



1



1



Mike Galgano @ITS_DA_MAIL_MAN · 6 May 2014

Best cart pusher in the game [#weismarkets](#)



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How do we implement sentiment analysis?

[Sentiment Analysis](#)

3. What if we let customers try our products first, before recommending, before seeking out their feedback?

What if we let
shoppers try
our products
first?



Delightful customer experience



If they try it, maybe they'll buy it



Can collect more data

try on
FULL FACE
looks!



Generative Adversarial Networks



GAN model is made up of a generator and discriminator



Generator tries to create "fake" images



Discriminator tries to determine if the images are "fake" or not



Monet \leftrightarrow Photos



Monet \rightarrow photo



photo \rightarrow Monet

Zebras \leftrightarrow Horses



zebra \rightarrow horse



horse \rightarrow zebra

Summer \leftrightarrow Winter



summer \rightarrow winter



winter \rightarrow summer



Photograph



Monet



Van Gogh



Cezanne



Ukiyo-e



HOW DO WE IMPLEMENT THIS!?

[Neural Style Transfer](#)

The knife cuts
both ways



Amazing results



But implementation is difficult



Maybe someday!

Recap



1. What to recommend to customers?

Popularity model.
Item-based collaborative filtering.
User-item collaborative filtering.



2. What do customers think of the products? Or what do your employees think of your company?

NLP.
-Sentiment analysis.



3. What if we let customers try our products before buying?

Generate Adversarial Networks.
-StarGAN.
-CycleGAN.