Product Categorization Model

Text & Image Based Classification Model



May 2023 Hye Lee

Problem Statement

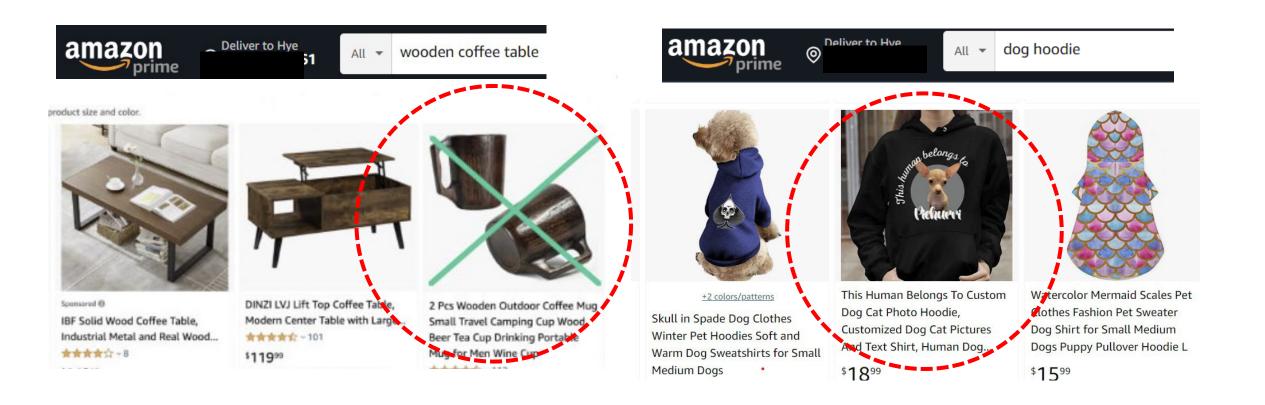


- About 60% of consumers search engines to research the item before making a purchase, reportedly. (link)
- However, many products are positioned in wrong category, and consequently sellers lose chances to sell their products and to reach their potential customers as well as buyers lose chances to purchase better products at better price.
- Proper categorization plays an important role in benefiting both sellers and consumers.

Problems



However, we commonly see many miscategorized products.



Procedure

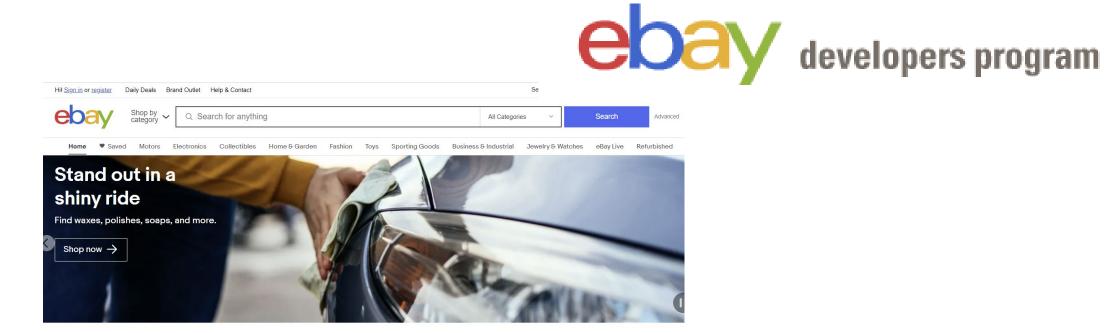


| API Data Collecting | Collected 25000 text + 15000 image data from eBay.com |
|--------------------------------------|--|
| Data Cleaning | Data re-categorized based on google category taxonomy |
| Data NLP & Preprocessing | Text data NLP & Vectorization (CountVectorizer/Word2Vec) |
| Text Classification Modeling | Multinomial Bayes, KNN, Logistic Regression, Random Forest |
| Image Classification Modeling | Transfer Learning |
| Text & Image Classification Modeling | Ensemble Classification with Soft Voting attempted |
| Streamlit App | "Be a Best Seller – Product Categorizer" |

Data Collecting



Collected 25,000 product data & 15,000 image data from eBay API



Re-categorizing



Products are re-categorized based on google shopping mall category taxonomy.

28 Main Categories

3841 Sub-Categories

25,000 products

Selected/ Removed uncommon categories **16 Categories**

22,000 products

Re-categorizing

28 Main Categories Clothing, Shoes & Accessories Sub-Categories Art 3841 Sub-Categories 25,000 products **Stamps Musical Instruments & Gear** Baby **Business & Industrial Cameras & Photo Consumer Electronics Cell Phones & Accessories** Computers/Tablets & Networking **Health & Beauty** Home & Garden **Pottery & Glass** Travel/luggage **Books & Magazines** Music **Business & Industrial Pet Supplies Sporting Goods Sports Mem, Cards & Fan Shop Toys & Hobbies Dolls & Bears Video Games & Consoles eBay Motors Jewelry & Watches**

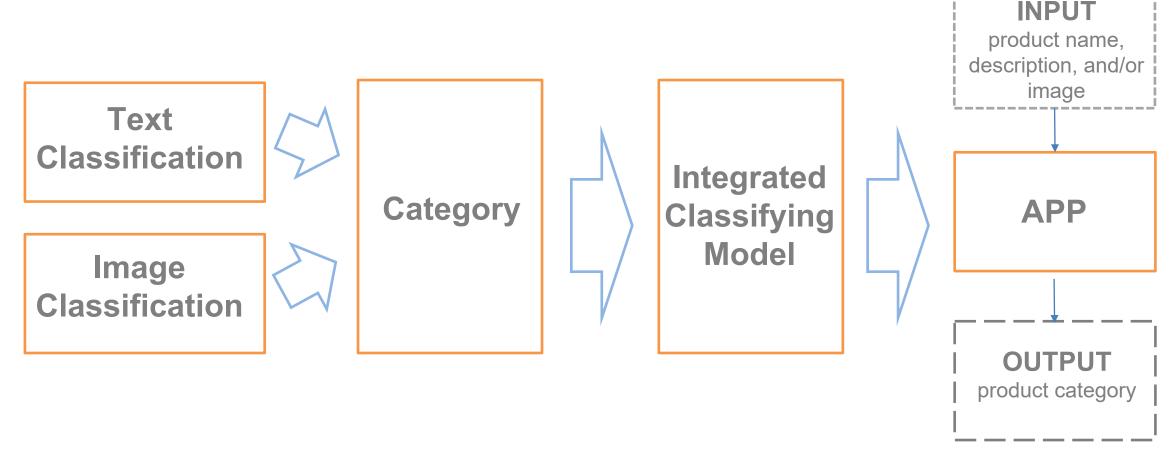
Gift Cards & Coupons

Removed uncommon categories

16 Categories Apparel_Accessories00 products **Arts_Entertainment** Baby_Toddler **Business_Industrial** Cameras_Optics **Consumer Electronics** Cell Phones **Computers Tablets** Health_Beauty Home_Garden Media **Pet Supplies Sporting Goods** Toys_Games **Vehicles Jewelry Watches**

Modeling Process (Planned)





Planned to create model combining text data + image data together as layers.

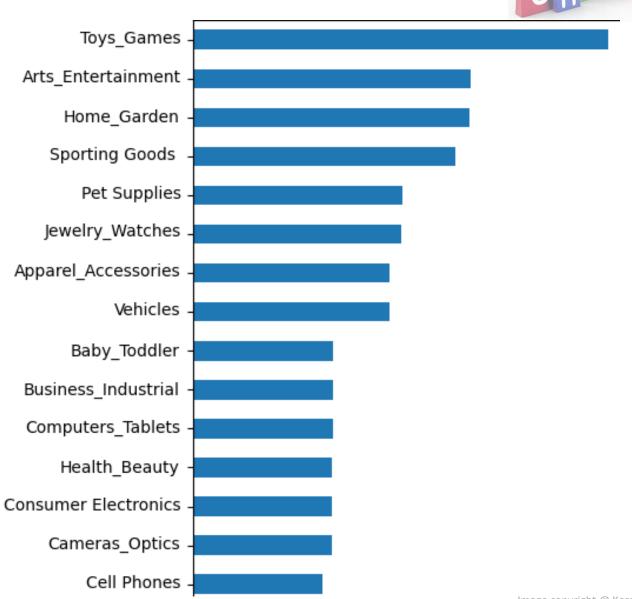
Data Preprocessing

SHOP

After cleaning:

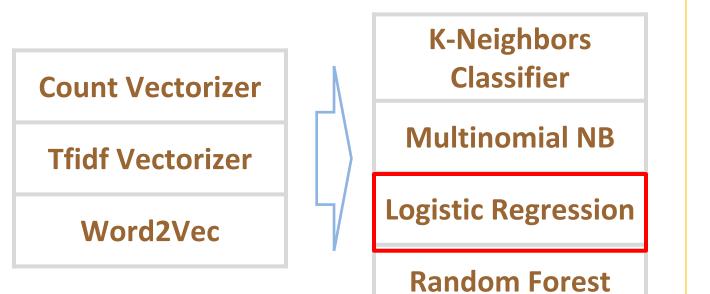
21,579 products with 15 categories

Toys & Games: 13.8%(baseline accuracy)



Text Classification Modeling

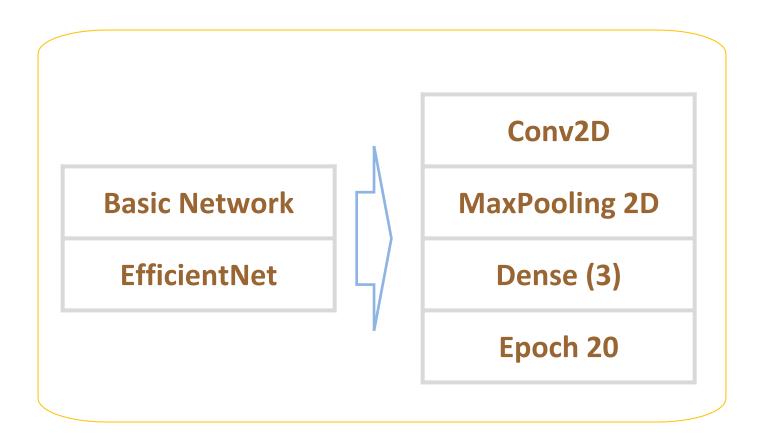




| | MNB | LGR | SGD | KNN | RF |
|--------|-----|-----|-----|-----|----|
| Train | 93 | 1 | 94 | 82 | 1 |
| Text | 85 | 92 | 87 | 73 | 64 |
| CrossV | 85 | 92 | 88 | 69 | 88 |
| ACC | 86 | 92 | 87 | 64 | 64 |

Image Classification Modeling





Accuracy: 0.9977

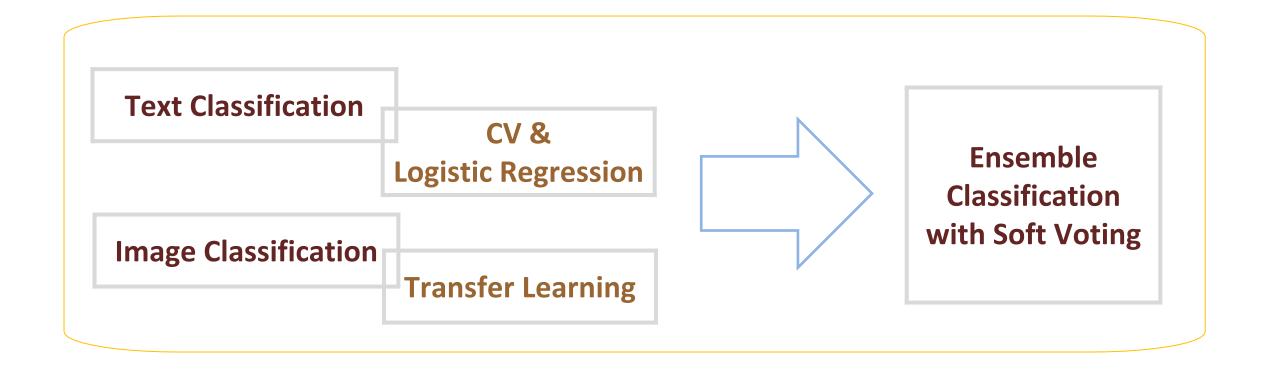
Loss: 0.0119

Val_accuracy: 0.2945

Val loss: 9.9992 -

Text & Image Classification Modeling

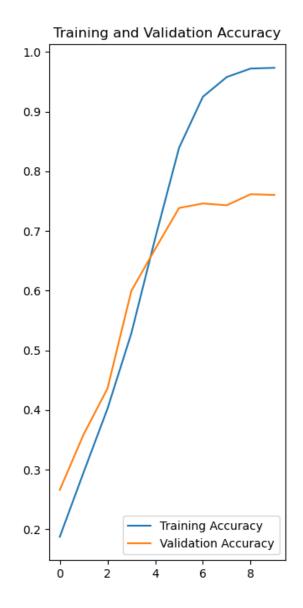




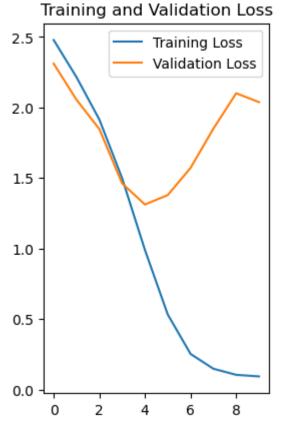
Was not able to find a way to put two different inputs (text, image) in Ensemble model.

Image Classification Modeling





10 epochs



1.0

Training Accuracy

10

Validation Accuracy

15

Training and Validation Accuracy

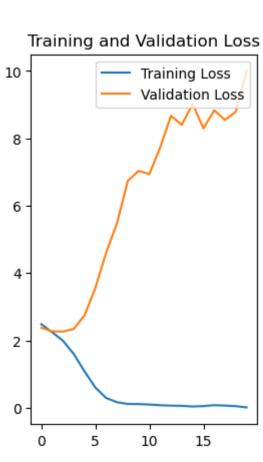
0.8

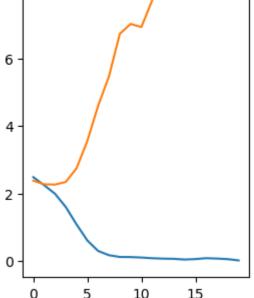
0.6

0.4

0.2

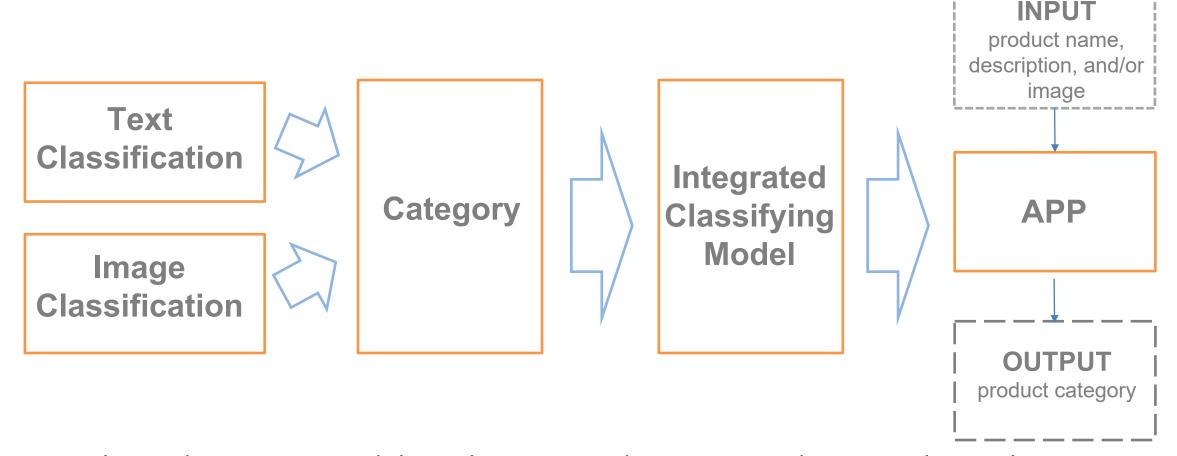






Modeling Process (Planned)

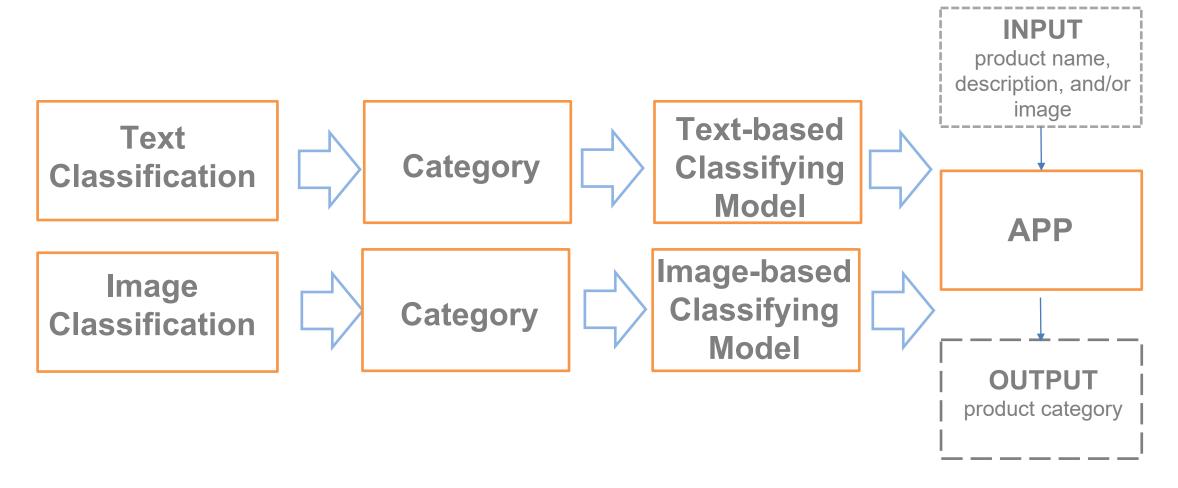




Planned to create model combining text data + image data together as layers.

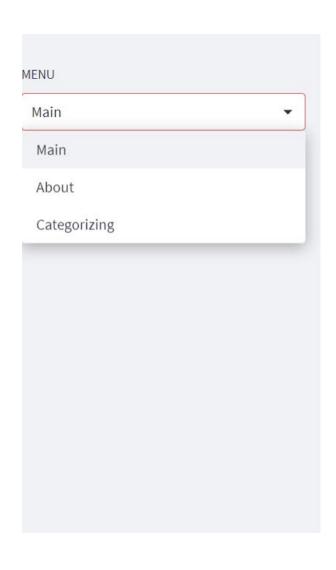
Modeling Process (Implemented)





APP Deployment





Be a Best Seller!

Where My Product To Be Displayed?

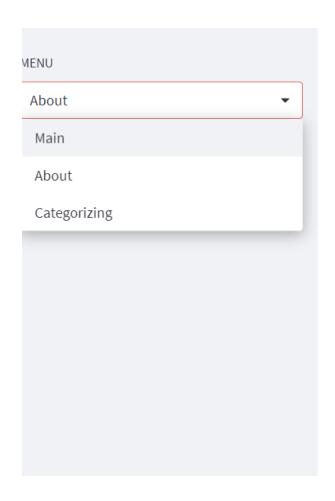
Find out in which shopping mall category your products should be.



@ CanStockPhoto.com

APP Deployment





Why Proper Categorization is Important?

About 60% of consumers use search engines to research the item before making a purchase. <u>link</u>

You can make your product show up not by only updating your product name and preparing your product listing, but also should categorize your products correctly.

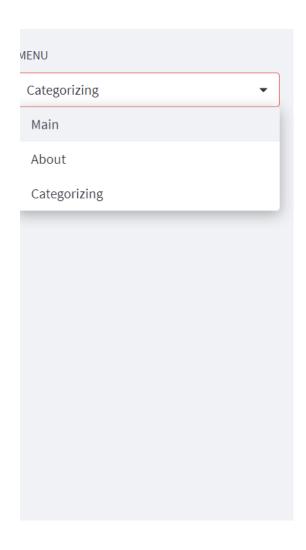
Proper categorization plays an important role in how well your products are discoverable and how often you can reach out to right shoppers.



Copyright Kozzi.com

APP Deployment





Let's find where to display your items in an online mall.

Doe do et Title | Doe do et lesses | Doe do et Title & Lesses

Category of Product

Categories: Apparel & Accessories, Arts & Entertainment, Baby & Toddler, Business & Industrial, Cameras & Optics, Cell Phones, Computers & Tablets, Consumer Electronics, Health & Beauty, Home & Garden, Jewelry & Watches, Media, Pet Supplies, Sporting Goods, Toys & Games, Vehicles

| Product fille Product fille & Image |
|--|
| Please type your product title descrbing your product. |
| Enter the product name. |
| |
| Your product name is: |

Application



Product Title Product Image Product Title & Image

Please type your product title descrbing your product.

Enter the product name.

dog hoodie

Your product name is:

dog hoodie





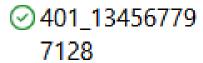
Properly works for clear description and image.

Problems in Trained Data

eBay categorized : Baby & Toddler

categorized : Business & Industrial







categorized : Camera



⊙ 504_11580120



⊙ 504_11580120



Ø 504_11580121



Ø 504_11580121





Problems in application

sun glasses

Category of Product

Your product category is: ['Health_Beauty']



Input Image

Your item category is: Consumer Electronics

Problems



- Many of eBay product images are uploaded by small business, so they are not professional and unclear. Clearer image data needed for better training.
- Ambiguous product title cannot be correctly classified.
- Ambiguous Categories: it is hard to distinguish the upper categories due to many lower categories of the same name. (such as pants under Apparel, Baby & Toddler, and Sporing Goods)

Text-Image based classification was not implemented due to technical issue: an
 Ensemble classification model includes multiple models but with the same inputs.

Recommendations



- Product naming need to represent the product for better classification. (With more description (such as brand, spec), text modeling will be more sophisticated.)
- Clearer product images are recommended for better categorization and for better representation.

Next Steps



- More detailed categorization is needed and to do so, more data need to be obtained and trained.
- eBay product title includes product name, brand, description, and spec. data has name with description, which is limited to describe all information of the product. So, other shopping mall data, such as Amazon, will be more useful to implement more detailed categorization.

Citations



- eBay API & developer https://developer.ebay.com/
- google product category taxonomy list
- https://www.google.com/basepages/producttype/taxonomy.en-US.txt
- Google Marketing Strategies
- https://www.thinkwithgoogle.com/marketing-strategies/search/global-shopper-productresearch-statistics/