WEB SCRAPING FOR E-COMMERCE VALIDATION

Economics Indicator Division / New Product R&D U.S. Census Bureau

Rebecca Weaver — New Products & Support Team Lead

Any opinions and conclusions expressed herein are those of the author(s) and do not reflect the views of the U.S. Census Bureau. The Census Bureau has reviewed this data product to ensure appropriate access, use, and disclosure avoidance protection of the confidential source data (Project No. P-7504206, Disclosure Review Board (DRB) approval number: CBDRB-FY23-ESMD010-031).



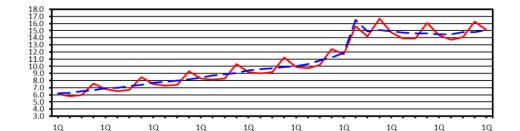


CORRINA CALANOC

Georgetown University Data Science & Analytics,

INTRODUCTION & MOTIVATION

- E-commerce is a key component of the retail sector and is reported by the EID in the Quarterly Retail E-Commerce report
- These numbers are speculated to be underestimates due to missing or inaccurate data
 - 6,400 retailers unresponsive or report no e-commerce



2018

2019

Not Adjusted — Adjusted

2021

2022

2023

Estimated Quarterly U.S. Retail E-commerce Sales as a Percent of Total Quarterly Retail Sales:

1st Quarter 2014 – 1st Quarter 2023

GOAL: Given a set of retailers and their websites, use web scraping to indicate whether that retailer has e-commerce. This process will then be used to update the retailers' e-commerce status in the Census database.

2014





2015

2016

2017

PROJECT DETAILS & PROCESS

Gather sample set of 500
retailers (incl. salt) with various
e-commerce statuses for training data.

Develop web scraper in Python & construct rules for e-commerce verification.
Iterate to maximize accuracy.

Gather sample of 200 retailers
(incl. salt) that all have not reported e-commerce.
Have retail analyst hand label set.

Run script on test set and report accuracy.



CHALLENGES

Gather sample set of **500**retailers (incl. salt) with various
e-commerce statuses for
training data.

Develop web scraper in Python & construct rules for e-commerce verification.

(incl. salt) that all have *not* reported e-commerce.

Have retail analyst hand label

Gather sample of 200 retailers

Run script on test set and report accuracy.



Many companies provide either blank or invalid URLs in the monthly survey

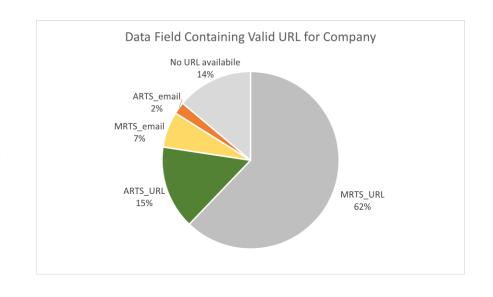




RESULTS - URL VALIDATION

Out of **500 companies** in the Training Set:

- 38% of retailers had invalid URLs from the monthly survey
- Out of these, the script was able to extract valid URLs from other sources for 63% of them
- URL Validation can be its own standalone process







CHALLENGES

Gather sample set of **500**retailers (incl. salt) with various
e-commerce statuses for
training data.

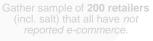


Many companies provide either blank or invalid URLs in the monthly survey Develop web scraper in Python & construct rules for ecommerce verification. Iterate to maximize accuracy.



E-Commerce indicators (keywords) are drastically different for different industries.

For the Auto Industry, definition of e-commerce verification is disputed across different retailers



Have retail analyst hand labe set.

Run script on test set and report accuracy.





Any opinions and conclusions expressed herein are those of the author(s) and do not reflect the views of the U.S. Census Bureau.

RESULTS - E-COMMERCE INDICATOR

Industry (# of Retailers)	Yes EC Accuracy %	No EC Accuracy %
Auto	17%	90%
Building and Garden	100%	25%
Clothing	93%	17%
Direct Selling	100%	100%
Electronic Shopping and Mail-Order	92%	0%
Electronics and Appliances	100%	75%
Furniture	100%	75%
Gasoline Stations		62%
General merchandise	100%	
Grocery	100%	36%
Hobby, music, books	100%	67%
Miscellaneous	100%	76%
Personal Care	100%	100%

Out of **500 companies** in the Training Set:

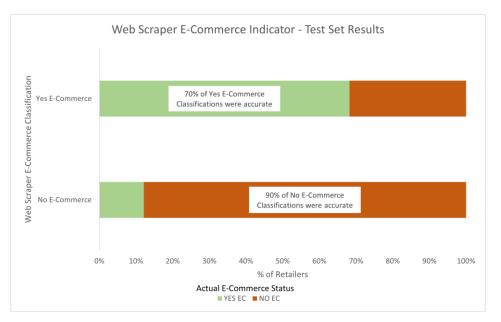
- Web scraper had a 74% accuracy
- 87% accuracy for identifying e-commerce
- 63% accuracy for identifying No e-commerce
- Script identified corrections to be made
 - 29% of retailers that consistently report no ecommerce were found to have e-commerce
- 9% of retailers that are consistently unresponsive were found to have e-commerce





RESULTS - E-COMMERCE INDICATOR

Out of 200 companies in the Test Dataset, the web scraper had a 80% accuracy







Any opinions and conclusions expressed herein are those of the author(s) and do not reflect the views of the U.S. Census Bureau.

NEXT STEPS & CONCLUSION

Next Steps:

- Run script on set of no e-commerce retailers & update database accordingly
- Periodically will run script in order to maintain e-commerce statuses

Future Enhancements:

- Implement parallel processing for get requests to improve on run time
- Utilize machine learning and NLP techniques for better keyword indicators



