

In Search of Spending

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01

The Problem & Context

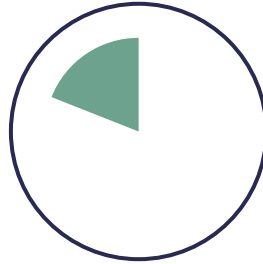
The E-commerce Market

\$602B



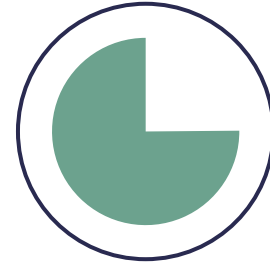
Online Spending (2019)

16%



% of Total
Retail (2019)

75%



Frequent
Shoppers

Our Goal

- Offer **personalized marketing**.
- Increase **revenue** from online store.
- Determine **which factors** influence consumer spending.





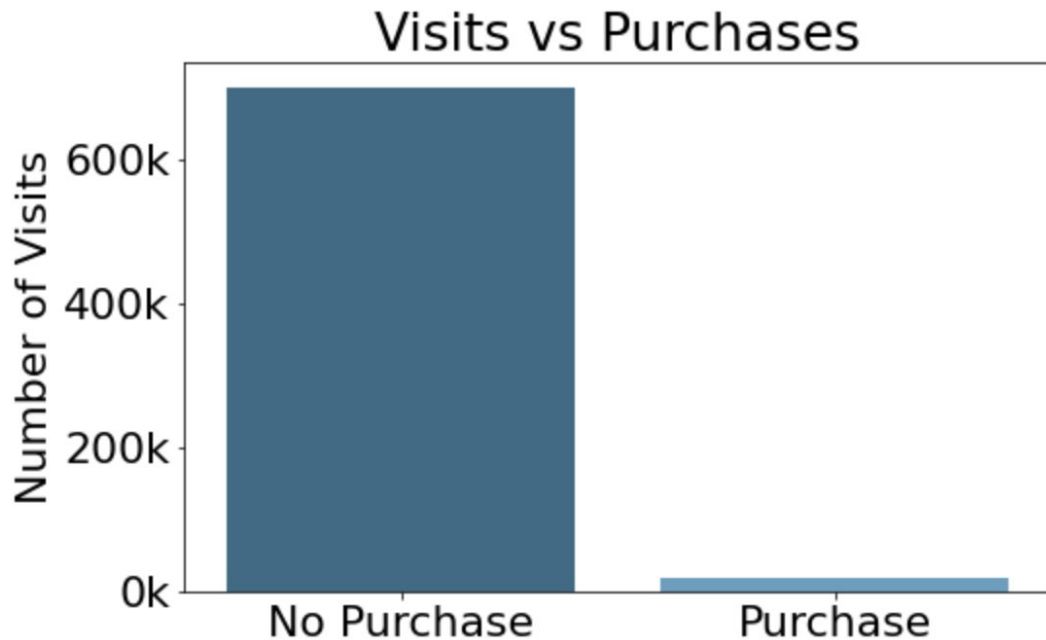
02

The Data

The Data

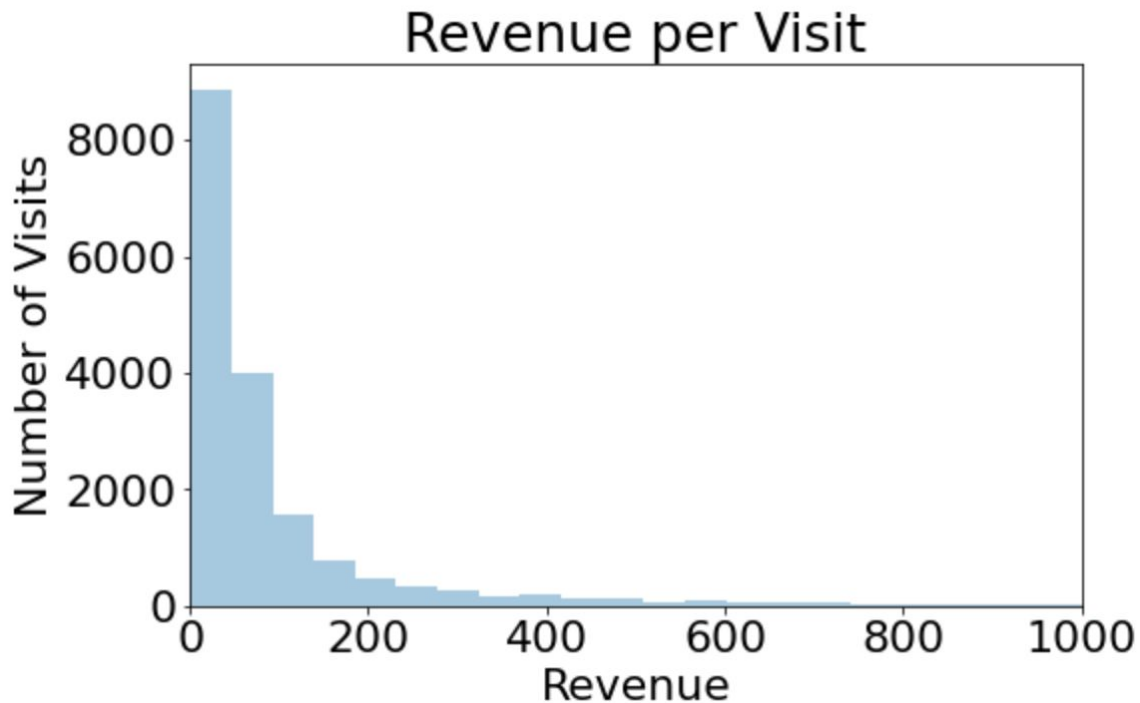
Breakdown

- 717k visits to Google's online store
- 2016-2018
- Variable Types:
 - Geographical
 - Economic
 - Device
 - User Activity
 - Price
- Merged economic data with Google data from Kaggle.*



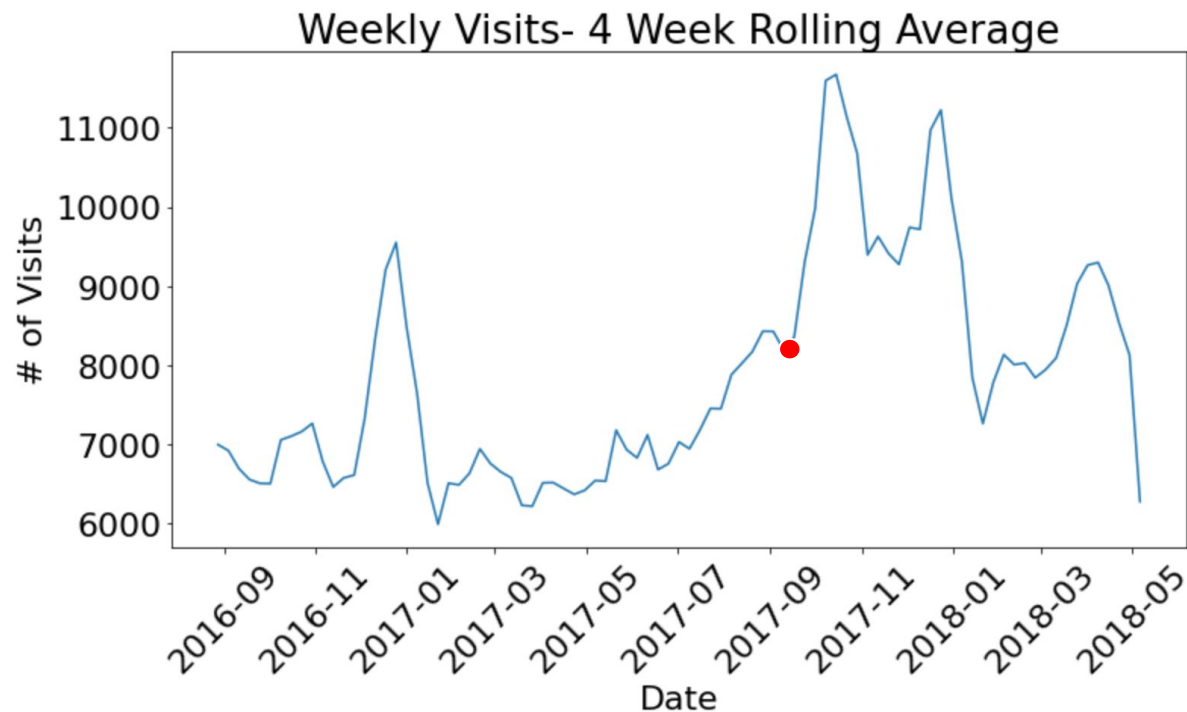
Breakdown: Purchases

- 2.46% of visits result in a purchase.
- Average Purchase: \$124



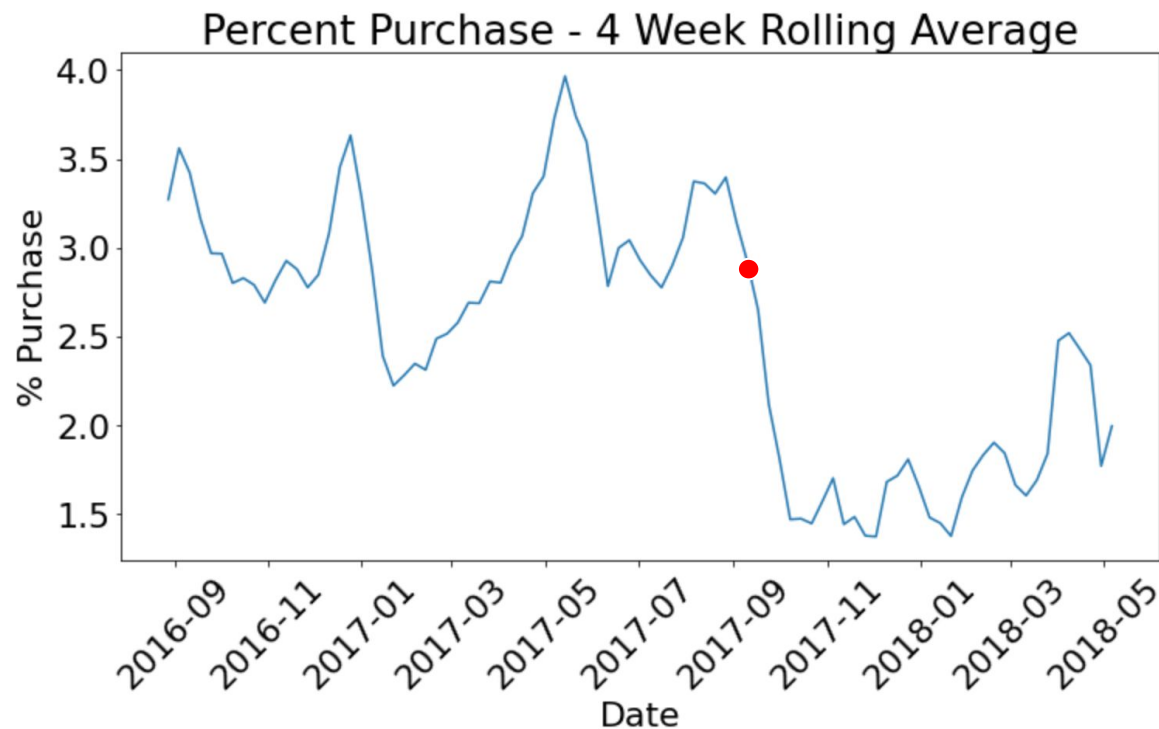
Purchases Over Time

- Visits increase with **launch** of new products.*



Purchases Over Time

- New visitors don't make purchases at the same rate.





Data Analysis

The Model

Random Forest Performance

- Our model can explain 32.6% of variance in revenue.

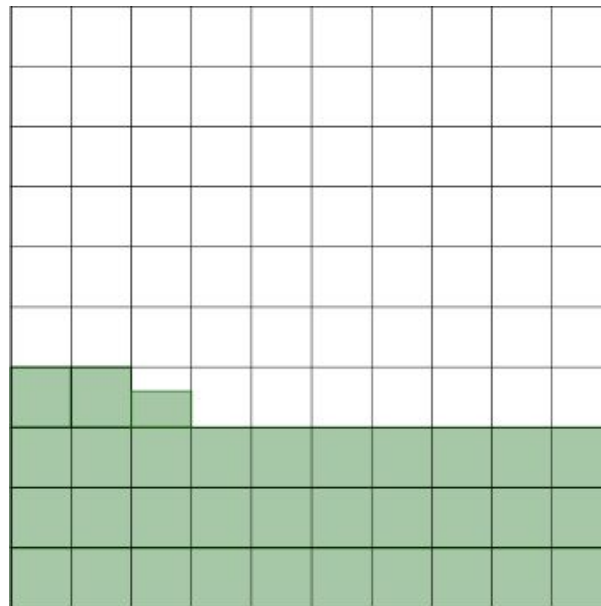


- Model Features



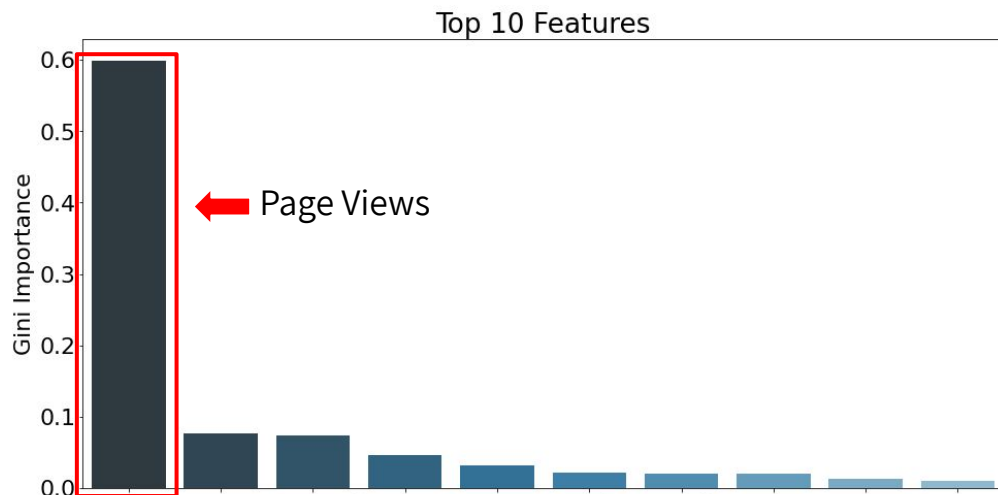
- Other Explanations

- Customer Income
- Previous Purchases
- Cart Data



Predicting Spending

Model Results



Interpretation:

- **Activity** and **time** spent on the site are key factors.

Predicting Spending

Model Results

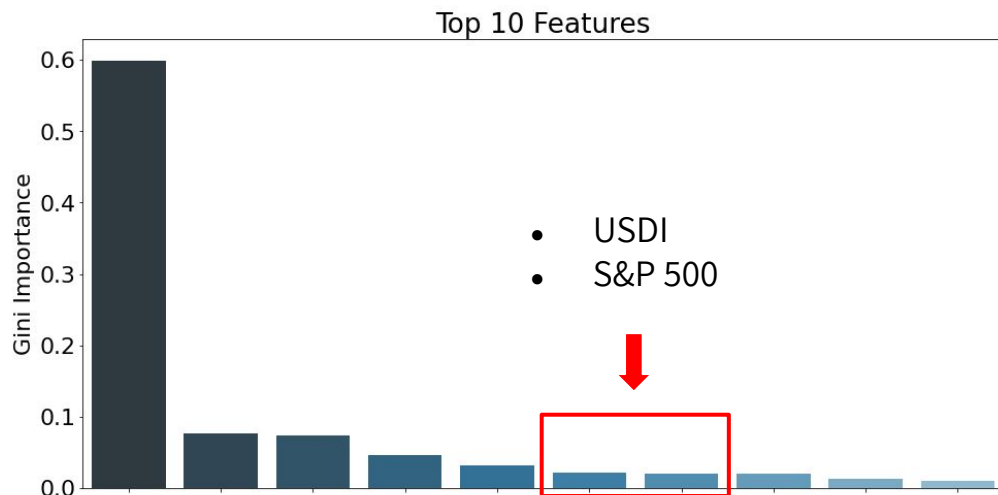


Interpretation:

- **Activity** and **time** spent on the site are key factors.

Predicting Spending

Model Results



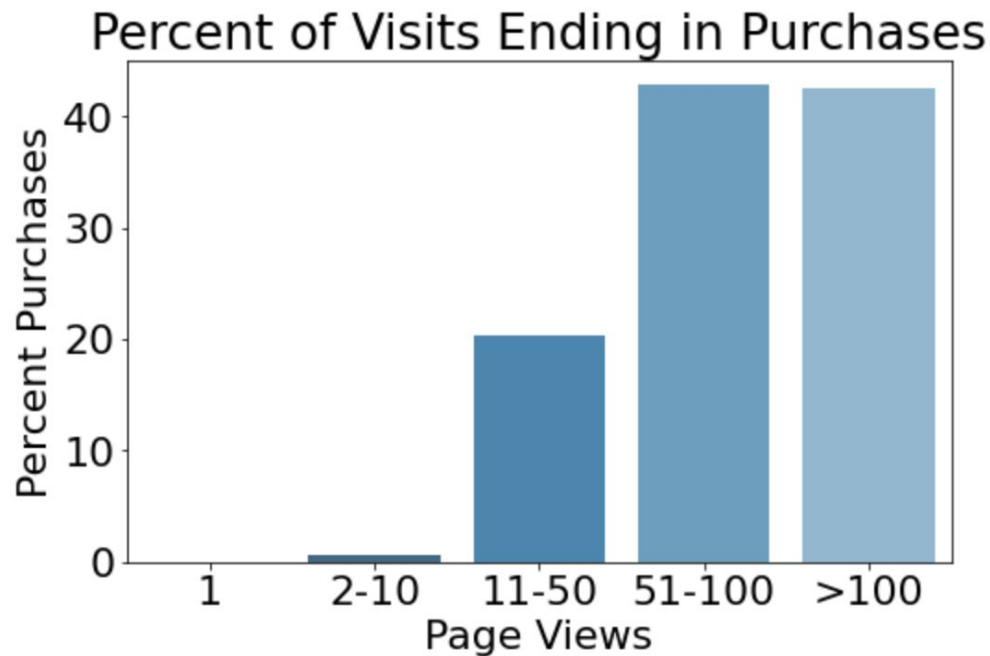
Interpretation:

- **Economic** environment is also important.

Page Views

Influence on Spending

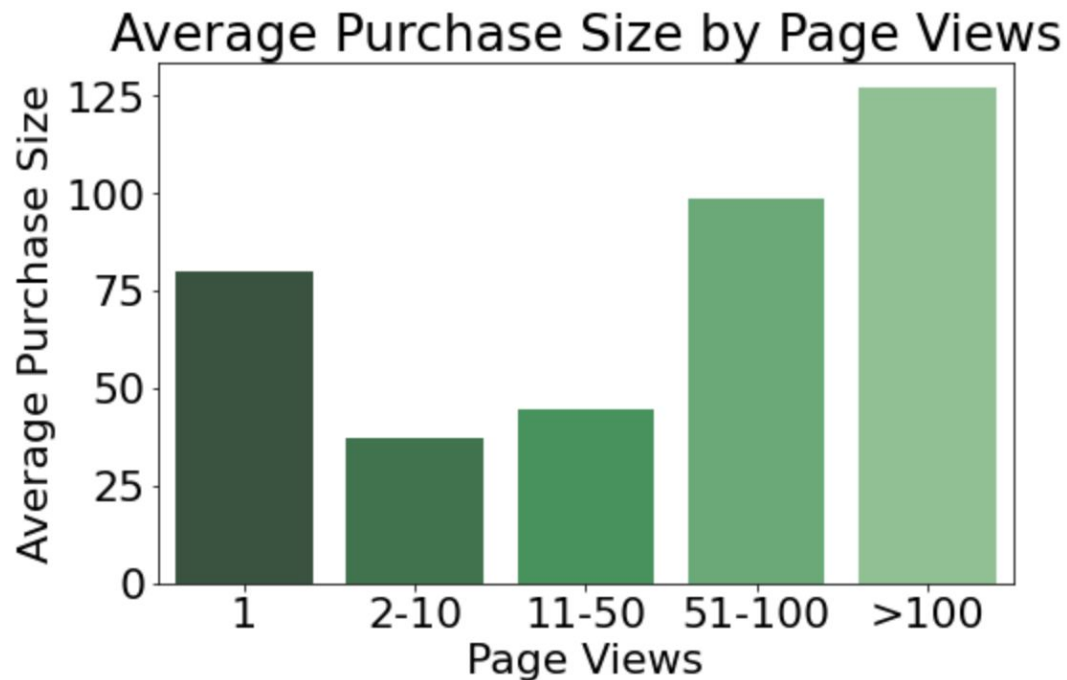
- More page views → Higher purchase **rate**.



Page Views

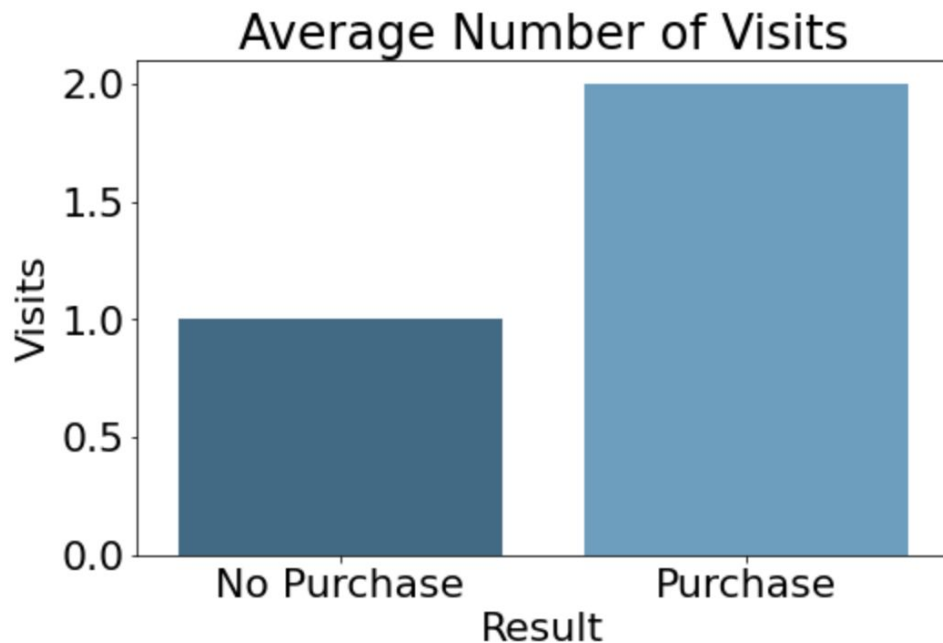
Influence on Spending

- More page views → Higher purchase **size**.



Number of Visits Influence on Spending

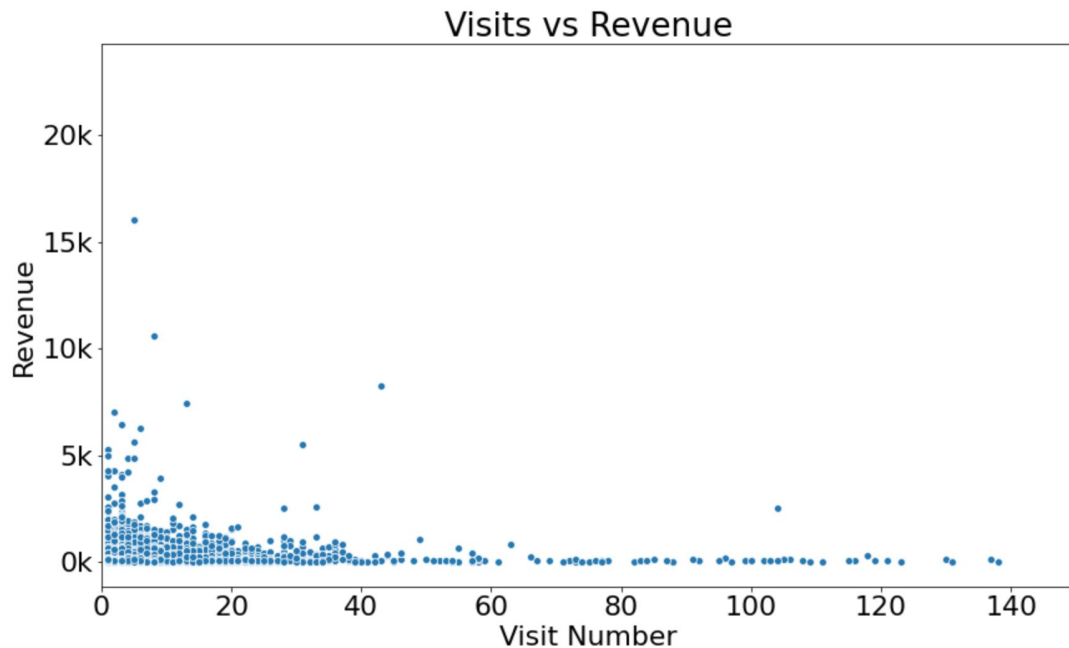
- Repeated visits → Purchases



Number of Visits

Influence on Spending

- Most purchases within first 25 visits.
- Purchases drop after 40 visits.



Recommendations

Keep Customers Coming Back

- Keep customers on the site.
 - Better product recommendations
 - Improved UI
- Offer discounts to buy within 25 visits.





04

Future
Improvements

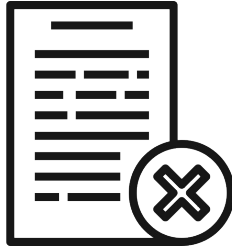
Limitations



The Data

Unavailable data

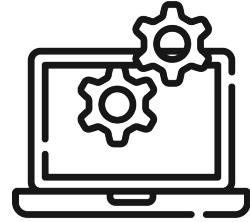
Generalizability



Sampling

Was there a **pattern** to data collection?

Is it **exhaustive**?



The Model

Limited **predictive** power

Computation **time**

Improvements



Additional Data

Consumer **Income**

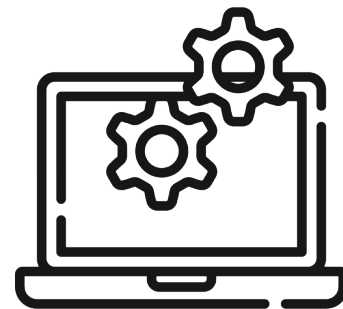
Past **Purchases**

Cart Info



Deployment

Deploy the model as a
web application



Improve Model

Try **different** ML models

Run on data from **other
stores**



Questions?

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* All images from [pexels](https://www.pexels.com/)