



BUSINESS OBJECTIVES

- Describe any purchasing patterns
- Identify the complementary products
- Identify the substitute products
- Select products requiring increased offerings



DATASETS

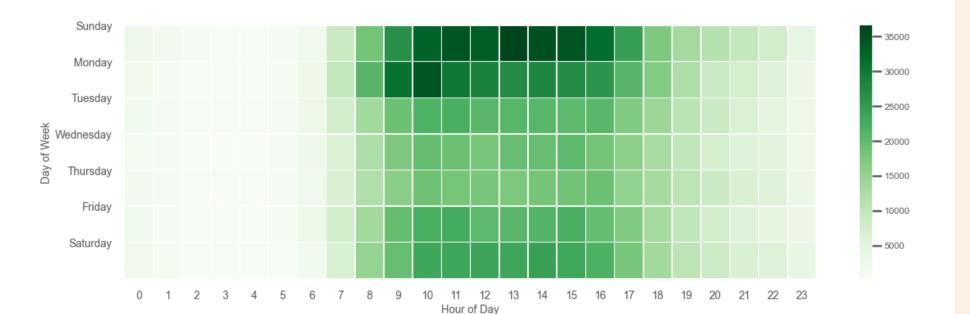
- 4 datasets: orders, order_products, departments and products
- Merged dataframe resulted in 2019501 records and 12 features
- 134 products previously grouped for computational capacity
- 21 departments of varying sizes

DATA INSIGHTS



Most Frequent Time: 9 am to 4 pm

Most Popular Days: Sunday Monday Period with Largest Number of Orders: Sunday at 1 pm



75% of orders

< 14 products

Most Frequent Number of Products: 4 to 7

DATA INSIGHTS



Reordered products: 63%

Reorder Rate by user:

- Between **60%** and **80%** → 25% of users
- **100%** \rightarrow 11% of users
- $0\% \rightarrow 5.6\%$ of users

Reorder Rate by order:

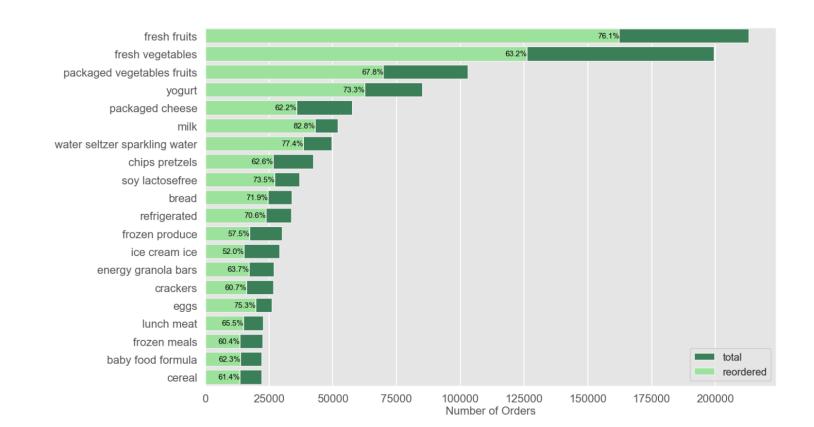
- 100% → 23% of orders
- **0%** → 6% of orders

Top Products Sold:

- 1. Fresh fruits
- 2. Fresh vegetables
- 3. Packaged Vegetables Fruits

Top Products Reordered:

- 1. Milk
- 2. Water Seltzer Sparkling Water
- 3. Fresh Fruits
- 4. Eggs





1. Select Frequent Item Sets

Support > 3% (= 60 555 orders)



62 products out of 134 397 sets (from 1 to 5 products)

- 2. Generate the association rules
- 3. Establish relationships between products

Support *Frequency*

 $\frac{A\cap C}{U}$

Conf. *Strength*

 $\frac{A\cap C}{A}$

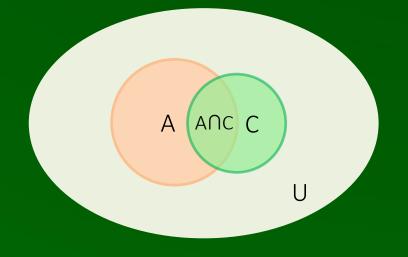
Expected Conf.

 $\frac{C}{U}$

Lift

Likelihood of consequent increases given an antecedent

 $\frac{Conf.}{Expected\ Conf.}$





Complementary Products





Chips pretzels



Fresh dips tapenades





Crackers



Lift > 1.5



Packaged cheese



Lunch meat





Bread

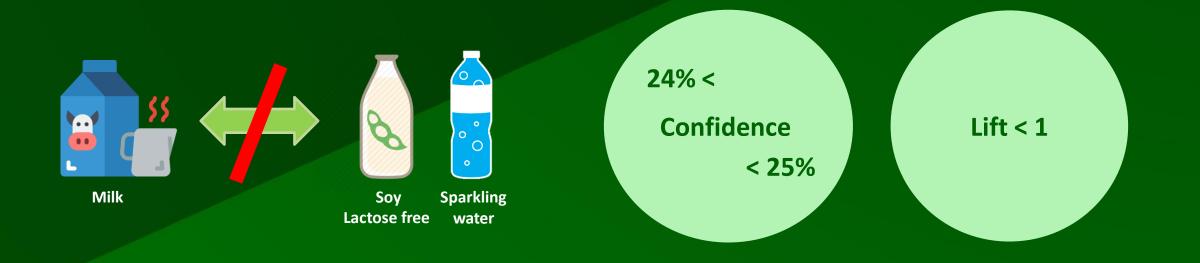
Hot dogs bacon sausage



Cream cheese



Substitute Products





DEPLOYMENT

- ✓ Suggestion of products (complementary products)
- ✓ Out of Stock pop-up (substitute products)
- ✓ Higher variety of yogurt and packaged vegetable fruits
- ✓ Bundles to increase popularity of lower selling products





Thank you!
Any questions?

