## Project Installation and instructions to run

## **File Summary**

• Data scraping code files

Website scraping 1: Scrapping.py

Website scraping 2: WhatsCooking.py

0

Exploratory Data Analysis : EDA.py

Association Rule Mining: AssociationRuleMining.py

• Recipe Recommendations: Recipe\_Recom.py

#### Installations

Package	Installation Direction
mlxtend	pip install mlxtend
	If problem persists, install using conda: conda install mlxtendchannel conda-forge
wordcloud	pip install wordcloud

### Datasets:

- 1. Instacart: https://www.instacart.com/datasets/grocery-shopping-2017
- 2. Recipe
  - a. Genius Kitchen: https://www.geniuskitchen.com/?ref=nav
  - b. United States Department of Agriculture: https://whatscooking.fns.usda.gov/search/recipes

Consolidated Data: File - Datasets\_Group4.xlsx

### Scrapping:

Website Source: <a href="https://www.geniuskitchen.com/?ref=nav">https://www.geniuskitchen.com/?ref=nav</a>

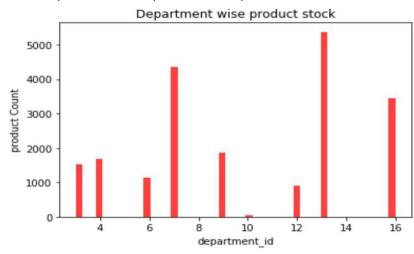
Output files : Recipes.csv

Screenshot

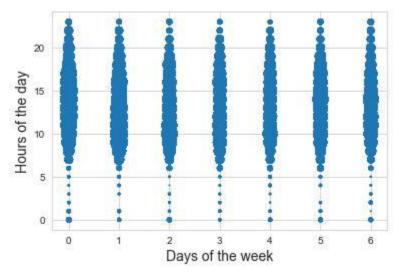
```
RESTART: C:\Users\alibh\OneDrive\Documents\1. Sem2\Python\Project\Scrapping.py
creamy burrito casserole
cracker barrels hashbrowns casserole copycat
tuna casserole
kittencals chicken crescent roll casserole
fantastic taco casserole
best ever tuna noodle casserole
easy breakfast casserole
easy creamy sour cream chicken casserole
kittencals moist cheddar garlic oven fried chicken breast
melt in your mouth chicken breasts
spinach feta stuffed chicken breast quick easy
thai chicken breasts
baked buffalo chicken breasts
chicken breasts in lemon cream sauce
weight watchers mexican chicken breasts
easy bone in split chicken breasts
creamy cajun chicken pasta
ro tel chicken spaghetti
chicken spaghetti
cheesecake factorys louisiana chicken pasta
cajun chicken pasta
tgi fridays copycat bruschetta chicken pasta
carmelas chicken rigatoni copycat romanos macaroni grill
caesar chicken pasta
```

### **Exploratory Data Analysis:**

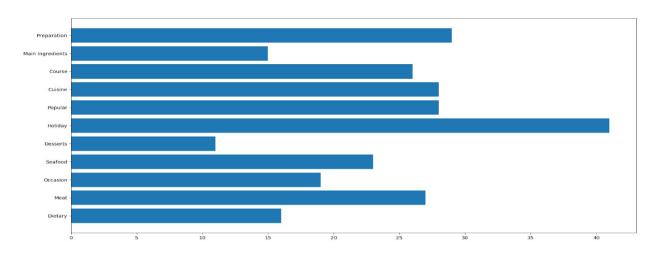
 Department Stocks: This is a visual showing the different variety of products offered by various departments i.e department-wise product stocks



2. **Popular Purchase Days/Hour**: This is a visual showing days on which number of purchases is more comparatively and also shows how the sales varies throughout the day.



3. **Category Repository**: The following visual shows the distribution of the number of recipes per category and is followed by a Word Cloud plot of the same for better inference.



Cuisine Cuisine

Meat Meat
Ingredients Main
Seafood Seafood
Occasion Occasion
Preparation Preparation
Popular Popular

Course Course
Main Ingredients
Desserts Desserts
Holiday Holiday

#### **Association Rule**

Screenshot of the results from Association Rule Mining

1. Screenshot showing a list of products which are bought more than 5 % of the time and 1% of the time

```
-- RESTART: C:\Users\Vipasha\Homework\AssociationRuleMining.py =======
Products that are bought more than Five percent of the time
                             itemsets
    support
0 0.122094 (Bag of Organic Bananas)
  0.148288
                              (Banana)
  0.064493
                        (Large Lemon)
                    (Organic Avocado)
3
  0.058807
  0.078078
              (Organic Baby Spinach)
  0.057580
             (Organic Hass Avocado)
  0.086365
              (Organic Strawberries)
   0.051611
                       (Strawberries)
Products that are bought more than one percent of the time
      support
                                                        itemsets length
0
     0.010312
                                        (100% Raw Coconut Water)
1
     0.018064
                                        (100% Whole Wheat Bread)
     0.012210
                                           (2% Reduced Fat Milk)
3
     0.017749
                                      (Apple Honeycrisp Organic)
     0.030841
                                                     (Asparagus)
5
     0.122094
                                        (Bag of Organic Bananas)
6
     0.148288
                                                        (Banana)
                             (Boneless Skinless Chicken Breasts)
7
     0.016700
8
     0.023634
                                                (Broccoli Crown)
     0.015399
                                              (Bunched Cilantro)
10
    0.019889
                                                       (Carrots)
                                                   (Clementines)
11
     0.010700
                                                                        1
12
     0.011644
                                              (Clementines, Bag)
                                                (Cucumber Kirby)
13
     0.019050
     0.016480
                                        (Extra Virgin Olive Oil)
14
                                                                        1
15
     0.011466
                                          (Feta Cheese Crumbles)
16
     0.021127
                                             (Fresh Cauliflower)
     0.010102
                                             (Fresh Ginger Root)
17
18
     0.015431
                                                        (Garlic)
                                           (Granny Smith Apples)
19
     0.011350
20
     0.012053
                                    (Grape White/Green Seedless)
21
     0.013658
                                                (Grated Parmesan)
                                             (Green Bell Pepper)
22
     0.020015
23
     0.011413
                                                  (Green Onions)
                                                   (Half & Half)
24
     0.019438
25
     0.012987
                                                  (Hass Avocado)
26
     0.018190
                                                 (Hass Avocados)
                                              (Honeycrisp Apple)
27
     0.028491
28
     0.015462
                                              (Jalapeno Peppers)
29
     0.015232
                                           (Large Alfresco Eggs)
     0.011508
91
                                         (Sparkling Lemon Water)
92
     0.014371
                               (Sparkling Natural Mineral Water)
                                                                        1
     0.027117
93
                                    (Sparkling Water Grapefruit)
                                                                        1
     0.017497
                                                  (Spring Water)
```

## 2. Screenshot showing a list of products which are bought together more than 20 % of the time

	0.030128	(Yell	ow Onions)	1			
03	0.017602 (Bag of Organic Bananas, Organic Baby Spinach)			2			
04	0.010154 (Organic Cucumber, Bag of Organic Bananas)			2			
05	0.018882 (Bag of Organic Bananas, Organic Hass Avocado)			2			
06	0.014204 (Organic Raspberries, Bag of Organic Bananas)			2 2 2			
07	0.024316 (Bag of Organic Bananas, Organic Strawberries)			2			
8.0	0.017046 (Banana, Large Lemon)						
09	0.010574 (Limes, Banana)			2 2 2 2 2			
10	0.017760 (Organic Avocado, Banana)		2				
11	0.015882 (Banana, Organic Baby Spinach)		2				
12				2			
13				2			
14				2			
15				2			
16		ganic Avocado, Organic Bab		2			
17		Baby Spinach, Organic Str		2			
18		c Strawberries, Organic Bl		2			
19		: Hass Avocado, Organic Str		2			
20	0.013228 (Organi	c Raspberries, Organic Str	awberries)	2			
		ore than 20 percent of the			200		
	antecedents	consequents					conviction
	(Organic Baby Spinach)	(Bag of Organic Bananas)		0.078078		0.008070	1.133435
	(Organic Cucumber)	(Bag of Organic Bananas)		0.036831	 2.258132		1.212083
	(Organic Hass Avocado)	(Bag of Organic Bananas)		0.057580	 2.685864	0.011852	1.306269
	(Organic Raspberries)	(Bag of Organic Bananas)		0.044058	 2.640427	0.008824	1.295574
	(Organic Strawberries)	(Bag of Organic Bananas)		0.086365	 2.306004		1.221944
	(Large Lemon)	(Banana)		0.064493	 1.782434	0.007483	1.157711
	(Large Lemon) (Limes)	(Banana) (Banana)		0.064493	 1.782434 1.474850	0.007483 0.003404	1.157711 1.090125
	(Large Lemon) (Limes) (Organic Avocado)	(Banana) (Banana) (Banana)		0.064493 0.048349 0.058807	 1.782434 1.474850 2.036563	0.007483 0.003404 0.009039	1.157711 1.090125 1.220214
	(Large Lemon) (Limes) (Organic Avocado) (Organic Baby Spinach)	(Banana) (Banana) (Banana) (Banana)		0.064493 0.048349 0.058807 0.078078	 1.782434 1.474850 2.036563 1.371740	0.007483 0.003404 0.009039 0.004304	1.157711 1.090125 1.220214 1.069201
	(Large Lemon) (Limes) (Organic Avocado) (Organic Baby Spinach) (Strawberries)	(Banana) (Banana) (Banana) (Banana) (Banana)		0.064493 0.048349 0.058807 0.078078 0.051611	 1.782434 1.474850 2.036563 1.371740 2.010754	0.007483 0.003404 0.009039 0.004304 0.007736	1.157711 1.090125 1.220214 1.069201 1.213560
0	(Large Lemon) (Limes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes)	(Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon)		0.064493 0.048349 0.058807 0.078078 0.051611 0.048349	 1.782434 1.474850 2.036563 1.371740 2.010754 4.181682	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972
0	(Large Lemon) (Limes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes) (Large Lemon)	(Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon) (Limes)		0.064493 0.048349 0.058807 0.078078 0.051611 0.048349 0.064493	 1.782434 1.474850 2.036563 1.371740 2.010754 4.181682 4.181682	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972 1.192814
0 1 2	(Large Lemon) (Limes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes) (Large Lemon) (Organic Blueberries)	(Banana) (Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon) (Limes) (Organic Strawberries)		0.064493 0.048349 0.058807 0.078078 0.051611 0.048349 0.064493 0.039275	 1.782434 1.474850 2.036563 1.371740 2.010754 4.181682 4.181682 2.972008	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921 0.009689	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972 1.192814 1.229123
0 1 2 3	(Large Lemon) (Limes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes) (Large Lemon) (Organic Blueberries) (Organic Hass Avocado)	(Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon) (Limes) (Organic Strawberries) (Organic Strawberries)		0.064493 0.048349 0.058807 0.078078 0.051611 0.048349 0.064493 0.039275 0.057580	 1.782434 1.474850 2.036563 1.371740 2.010754 4.181682 4.181682 2.972008 2.455399	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921 0.009689 0.007238	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972 1.192814 1.229123 1.159524
5 7 8 10 11 12 13	(Large Lemon) (Limes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes) (Large Lemon) (Organic Blueberries)	(Banana) (Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon) (Limes) (Organic Strawberries)		0.064493 0.048349 0.058807 0.078078 0.051611 0.048349 0.064493 0.039275	 1.782434 1.474850 2.036563 1.371740 2.010754 4.181682 4.181682 2.972008	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921 0.009689	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972 1.192814 1.229123
0 1 2 3 4	(Large Lemon) (Cimes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes) (Large Lemon) (Organic Blueberries) (Organic Hass Avocado) (Organic Raspberries) rows x 9 columns]	(Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon) (Limes) (Organic Strawberries) (Organic Strawberries)		0.064493 0.048349 0.058807 0.078078 0.051611 0.048349 0.064493 0.039275 0.057580 0.044058	 1.782434 1.474850 2.036563 1.371740 2.010754 4.181682 4.181682 2.972008 2.455399	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921 0.009689 0.007238	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972 1.192814 1.229123 1.159524
0 1 2 3 4	(Large Lemon) (Cimes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes) (Large Lemon) (Organic Blueberries) (Organic Hass Avocado) (Organic Raspberries) rows x 9 columns]	(Banana) (Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon) (Limes) (Organic Strawberries) (Organic Strawberries)	ught togeth	0.064493 0.048349 0.058807 0.078078 0.051611 0.048349 0.064493 0.039275 0.057580 0.044058	 1.782434 1.474850 2.036563 1.371740 2.010754 4.181682 4.181682 2.972008 2.455399	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921 0.009689 0.007238	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972 1.192814 1.229123 1.159524
0 1 2 3 4 15	(Large Lemon) (Limes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes) (Large Lemon) (Organic Blueberries) (Organic Hass Avocado) (Organic Raspberries) rows x 9 columns]	(Banana) (Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon) (Limes) (Organic Strawberries) (Organic Strawberries) (Organic Strawberries)	ught togeth antecedent	0.064493 0.048349 0.058807 0.078078 0.051611 0.048349 0.064493 0.039275 0.057580 0.044058	 1.782434 1.474850 2.036563 1.371740 2.010754 4.181682 4.181682 2.972008 2.455399 3.476387	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921 0.006689 0.007238 0.009423	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972 1.192814 1.229123 1.159524 1.305637
0 1 2 3 4 15	(Large Lemon) (Limes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes) (Large Lemon) (Organic Blueberries) (Organic Hass Avocado) (Organic Raspberries) rows x 9 columns] unct which are more than antecedents	(Banana) (Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon) (Limes) (Organic Strawberries) (Organic Strawberries) (Organic Strawberries)	ught togeth antecedent	0.064493 0.048349 0.058807 0.078078 0.051611 0.048349 0.064493 0.0639275 0.057580 0.044058	 1.782434 1.474850 2.036563 1.371740 2.010754 4.181682 4.181682 2.972008 2.455399 3.476387	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921 0.006689 0.007238 0.009423	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972 1.192814 1.229123 1.159524 1.305637
0 1 2 3 4	(Large Lemon) (Limes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes) (Large Lemon) (Organic Blueberries) (Organic Blueberries) (Organic Rasperries) rows x 9 columns] uct which are more than antecedents (Organic Hass Avocado)	(Banana) (Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon) (Limes) (Organic Strawberries) (Organic Strawberries) (Organic Strawberries)  2.5 times likely to be bo  consequents (Bag of Organic Bananas)	ught togeth antecedent	0.064493 0.048349 0.058807 0.078078 0.051611 0.048349 0.064493 0.039275 0.057580 0.044058	1.782434 1.4774850 2.036563 1.371740 2.010754 4.181682 2.972008 2.455399 3.476387	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921 0.006689 0.007238 0.007238	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972 1.192814 1.229123 1.159524 1.305637
0 1 2 3 4 15 'roo	(Large Lemon) (Limes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes) (Large Lemon) (Organic Blueberries) (Organic Hass Avocado) (Organic Raspberries) rows x 9 columns] uct which are more than antecedents (Organic Hass Avocado) (Organic Raspberries)	(Banana) (Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon) (Limes) (Organic Strawberries) (Organic Strawberries) (Organic Strawberries)  a 2.5 times likely to be bo consequents (Bag of Organic Bananas) (Bag of Organic Bananas)	ught togeth antecedent	0.064493 0.048349 0.058807 0.078078 0.051611 0.048349 0.064493 0.039275 0.057580 0.044058	 1.782434 1.474850 2.036563 1.371740 2.010754 4.181682 4.181682 2.972008 2.455399 3.476387	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921 0.006689 0.007238 0.009423	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972 1.192814 1.229123 1.159524 1.305637
	(Large Lemon) (Limes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes) (Large Lemon) (Organic Blueberries) (Organic Hass Avocado) (Organic Raspberries) rows x 9 columns] tuct which are more than antecedents (Organic Hass Avocado) (Organic Raspberries) (Clarge Lemon)	(Banana) (Banana) (Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon) (Limes) (Organic Strawberries) (Organic Strawberries) (Organic Strawberries)  2.5 times likely to be bo consequents (Bag of Organic Bananas) (Bag of Organic Bananas) (Large Lemon) (Limes)	ught togeth antecedent	0.064493 0.048349 0.058807 0.078078 0.051611 0.048349 0.064493 0.039275 0.057580 0.044058	 1.782434 1.474850 2.036563 1.371740 2.010754 4.181682 4.181682 2.972008 2.455399 3.476387	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921 0.006689 0.007238 0.009423	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972 1.192814 1.229123 1.159524 1.305637
0 1 2 3 4 15	(Large Lemon) (Cimes) (Organic Avocado) (Organic Baby Spinach) (Strawberries) (Limes) (Large Lemon) (Organic Blueberries) (Organic Hass Avocado) (Organic Raspberries) rows x 9 columns] that which are more than antecedents (Organic Hass Avocado) (Organic Raspberries) (Corganic Raspberries) (Usines)	(Banana) (Banana) (Banana) (Banana) (Banana) (Banana) (Large Lemon) (Limes) (Organic Strawberries) (Organic Strawberries) (Organic Strawberries)  2.5 times likely to be bo consequents (Bag of Organic Bananas) (Bag of Organic Bananas) (Large Lemon)	ught togeth antecedent	0.064493 0.048349 0.058807 0.078078 0.051611 0.048349 0.051617 0.057580 0.044058 err support 0.057580 0.044058 0.044058	 1.782434 1.474850 2.036563 1.371740 2.010754 4.181682 4.181682 2.972008 2.455399 3.476387 11fft 2.685864 2.640427 4.181682 4.181682	0.007483 0.003404 0.009039 0.004304 0.007736 0.009921 0.006689 0.007238 0.009423	1.157711 1.090125 1.220214 1.069201 1.213560 1.280972 1.192814 1.229123 1.159524 1.305637

# **Recipe Suggestion:**

# Screenshot of the results of *Recipe Recommendation* for a given order

	RecipeName	Ingredients	Directions	CookingTime	Serves
635	bacon wrapped pork chops with bbq sauce	4 boneless pork chops (about 1 inch thick);1/	Preheat oven to 400°F.;On work surface layer	READYIN:1hr5mins	SERVES:4
646	mardi gras coleslaw	2 cups shredded red cabbage;2 cups shredded	Toss both kinds of cabbage, the grated carrots	READYIN:15mins	SERVES:5-8
651	blt barbecue chicken salad	1/2 cup mayonnaise;3 -4 tablespoons barbecu	In a small bowl, mix the mayo, bbq sauce, onio	READYIN:10mins	SERVES:8

## Complete set of instructions to run the project:

- 1. Install the required packages as directed in the installation section table
- 2. Run EDA.py for scrapping and visualization
- 3. Open DeliciousDaily.py in Idle which calls all the other required modules
- 4. The first module to run is Scrapping.py which scraps the data and creates text files for convenience so that the scraping code need not be run after the first time and the text files can be used instead.
- 5. After scraping, the data has been consolidated in a single excel containing separate excel sheets corresponding to different information
- 6. Next, Exploratory Data Analysis was performed and its results are shown above.
- 7. After EDA, Association Rule Mining was performed on the Instacart dataset and discovered association between different types products that are bought together
- 8. The final step was recommending recipes based on a customer's cart contents. This application recommends the top 3 recipes fitting the customer's purchase order.