

```
# Step 1: Import necessary libraries
```

```
import pandas as pd
!pip install apyori
from apyori import apriori
```

```
Collecting apyori
```

```
  Downloading apyori-1.1.2.tar.gz (8.6 kB)
```

```
  Preparing metadata (setup.py) ... e=apyori-1.1.2-py3-none-any.whl
size=5953
```

```
sha256=abac294162e660f49a27d472b642312cb7fc68b86a42bc601964e2336ea9b4e
c
```

```
  Stored in directory:
```

```
/root/.cache/pip/wheels/c4/1a/79/20f55c470a50bb3702a8cb7c94d8ada155735
38c7f4baebe2d
```

```
Successfully built apyori
```

```
Installing collected packages: apyori
```

```
Successfully installed apyori-1.1.2
```

```
# Step 2: Load the dataset
```

```
data=pd.read_csv(r"/content/Market_Basket_Optimisation -
Copy.csv",header=None)
```

```
data
```

```
{"summary":{"\n  \"name\": \"data\",\n  \"rows\": 7501,\n  \"fields\": [\n    {\n      \"column\": 0,\n      \"properties\": {\n        \"dtype\": \"category\",\n        \"num_unique_values\": 115,\n        \"samples\": [\n          \"gums\",\n          \"mineral water\",\n          \"pancakes\",\n          ],\n        \"semantic_type\": \"\",\n        \"description\": \"\",\n        \"column\": 1,\n        \"properties\": {\n          \"dtype\": \"category\",\n          \"num_unique_values\": 117,\n          \"samples\": [\n            \"tomatoes\",\n            \"french fries\",\n            \"eggplant\",\n            ],\n          \"semantic_type\": \"\",\n          \"description\": \"\",\n          \"column\": 2,\n          \"properties\": {\n            \"dtype\": \"category\",\n            \"num_unique_values\": 115,\n            \"samples\": [\n              \"mint\",\n              \"green tea\",\n              \"mashed potato\",\n              ],\n            \"semantic_type\": \"\",\n            \"description\": \"\",\n            \"column\": 3,\n            \"properties\": {\n              \"dtype\": \"category\",\n              \"num_unique_values\": 114,\n              \"samples\": [\n                \"toothpaste\",\n                \"spaghetti\",\n                \"cottage cheese\",\n                ],\n            \"semantic_type\": \"\",\n            \"description\": \"\",\n            \"column\": 4,\n            \"properties\": {\n              \"dtype\": \"category\",\n              \"num_unique_values\": 110,\n              \"samples\": [\n                \"magazines\",\n                \"energy bar\",\n                \"mineral water\",\n                ],\n            \"semantic_type\": \"\",\n            \"description\": \"\",\n            \"column\": 5,\n            \"properties\": {\n              \"dtype\": \"category\",\n
```

```
\num_unique_values\: 106,\n          \"samples\": [\n              \"flax seed\",\n              \"energy drink\",\n              \"green tea\"],\n          \"semantic_type\": \"\", \n          \"description\": \"\"\n    },\n    {\n        \"column\": 6,\n        \"properties\": {\n            \"dtype\": \"category\", \n            \"num_unique_values\": 102,\n            \"samples\": [\n                \"energy drink\", \n                \"zucchini\", \n                \"extra dark chocolate\" ],\n            \"semantic_type\": \"\", \n            \"description\": \"\" }},\n        {\n            \"column\": 7,\n            \"properties\": {\n                \"dtype\": \"category\", \n                \"num_unique_values\": 98,\n                \"samples\": [\n                    \"whole wheat flour\", \n                    \"pasta\", \n                    \"body spray\" ],\n                \"semantic_type\": \"\", \n                \"description\": \"\" }},\n        {\n            \"column\": 8,\n            \"properties\": {\n                \"dtype\": \"category\", \n                \"num_unique_values\": 88,\n                \"samples\": [\n                    \"strawberries\", \n                    \"energy drink\", \n                    \"mashed potato\" ],\n                \"semantic_type\": \"\", \n                \"description\": \"\" }\n    },\n    {\n        \"column\": 9,\n        \"properties\": {\n            \"dtype\": \"category\", \n            \"num_unique_values\": 80,\n            \"samples\": [\n                \"rice\", \n                \"tomato juice\", \n                \"cake\" ],\n            \"semantic_type\": \"\", \n            \"description\": \"\" }\n    },\n    {\n        \"column\": 10,\n        \"properties\": {\n            \"dtype\": \"category\", \n            \"num_unique_values\": 66,\n            \"samples\": [\n                \"strong cheese\", \n                \"bramble\", \n                \"low fat yogurt\" ],\n            \"semantic_type\": \"\", \n            \"description\": \"\" }\n    },\n    {\n        \"column\": 11,\n        \"properties\": {\n            \"dtype\": \"category\", \n            \"num_unique_values\": 50,\n            \"samples\": [\n                \"frozen smoothie\", \n                \"green grapes\", \n                \"brownies\" ],\n            \"semantic_type\": \"\", \n            \"description\": \"\" }\n    },\n    {\n        \"column\": 12,\n        \"properties\": {\n            \"dtype\": \"category\", \n            \"num_unique_values\": 43,\n            \"samples\": [\n                \"magazines\", \n                \"burger sauce\", \n                \"white wine\" ],\n            \"semantic_type\": \"\", \n            \"description\": \"\" }\n    },\n    {\n        \"column\": 13,\n        \"properties\": {\n            \"dtype\": \"category\", \n            \"num_unique_values\": 28,\n            \"samples\": [\n                \"pancakes\", \n                \"yogurt cake\", \n                \"toothpaste\" ],\n            \"semantic_type\": \"\", \n            \"description\": \"\" }\n    },\n    {\n        \"column\": 14,\n        \"properties\": {\n            \"dtype\": \"category\", \n            \"num_unique_values\": 19,\n            \"samples\": [\n                \"mineral water\", \n                \"pancakes\", \n                \"fresh bread\" ],\n            \"semantic_type\": \"\", \n            \"description\": \"\" }\n    },\n    {\n        \"column\": 15,\n        \"properties\": {\n            \"dtype\": \"category\", \n            \"num unique values\": 8,\n            \"samples\": [\n
```

```

\"chocolate\", \n          \"sparkling water\", \n          \"salmon\" \n
], \n          \"semantic_type\": \"\", \n          \"description\": \"\" \n
} \n      }, \n      { \n          \"column\": 16, \n          \"properties\": { \n
\"dtype\": \"category\", \n          \"num_unique_values\": 3, \n
\"samples\": [ \n          \"antioxydant juice\", \n          \"frozen
smoothie\", \n          \"french fries\" \n      ], \n
\"semantic_type\": \"\", \n          \"description\": \"\" \n      } \n
}, \n      { \n          \"column\": 17, \n          \"properties\": { \n
\"dtype\": \"category\", \n          \"num_unique_values\": 3, \n
\"samples\": [ \n          \"frozen smoothie\", \n          \"protein
bar\", \n          \"spinach\" \n      ], \n          \"semantic_type\":
\"\", \n          \"description\": \"\" \n      } \n      }, \n      { \n
\"column\": 18, \n          \"properties\": { \n          \"dtype\":
\"category\", \n          \"num_unique_values\": 3, \n          \"samples\":
[ \n          \"spinach\", \n          \"mayonnaise\", \n
\"cereals\" \n      ], \n          \"semantic_type\": \"\", \n
\"description\": \"\" \n      } \n      }, \n      { \n          \"column\": 19, \n
\"properties\": { \n          \"dtype\": \"category\", \n
\"num_unique_values\": 1, \n          \"samples\": [ \n          \"olive
oil\" \n      ], \n          \"semantic_type\": \"\", \n
\"description\": \"\" \n      } \n      } \n  ] \n
n} \", \"type\": \"dataframe\", \"variable_name\": \"data\"}

```

Step 3: Check for missing values

```
data.isnull().sum()
```

```

0      0
1    1754
2    3112
3    4156
4    4972
5    5637
6    6132
7    6520
8    6847
9    7106
10   7245
11   7347
12   7414
13   7454
14   7476
15   7493
16   7497
17   7497
18   7498
19   7500
dtype: int64

```

Step 4: Fill missing values with 0

```
data.fillna(0, inplace=True)
```

Step 5: Display the first few rows of the data

```
data.head()
```

```
{"summary":{"\n  \"name\": \"data\",\n  \"rows\": 7501,\n  \"fields\": [\n    {\n      \"column\": 0,\n      \"properties\": {\n        \"dtype\": \"category\",\n        \"num_unique_values\": 115,\n        \"samples\": [\n          \"gums\",\n          \"mineral water\",\n          \"pancakes\"],\n        \"semantic_type\": \"\",\n        \"description\": \"\",\n        \"column\": 1,\n        \"properties\": {\n          \"dtype\": \"category\",\n          \"num_unique_values\": 118,\n          \"samples\": [\n            \"bacon\",\n            \"shampoo\",\n            \"milk\"],\n          \"semantic_type\": \"\",\n          \"description\": \"\",\n          \"column\": 2,\n          \"properties\": {\n            \"dtype\": \"category\",\n            \"num_unique_values\": 116,\n            \"samples\": [\n              \"zucchini\",\n              \"shallot\",\n              \"tomato sauce\"],\n            \"semantic_type\": \"\",\n            \"description\": \"\",\n            \"column\": 3,\n            \"properties\": {\n              \"dtype\": \"category\",\n              \"num_unique_values\": 115,\n              \"samples\": [\n                \"toothpaste\",\n                \"honey\",\n                \"ground beef\"],\n            \"semantic_type\": \"\",\n            \"description\": \"\",\n            \"column\": 4,\n            \"properties\": {\n              \"dtype\": \"category\",\n              \"num_unique_values\": 111,\n              \"samples\": [\n                \"cider\",\n                \"milk\",\n                \"oil\"],\n            \"semantic_type\": \"\",\n            \"description\": \"\",\n            \"column\": 5,\n            \"properties\": {\n              \"dtype\": \"category\",\n              \"num_unique_values\": 107,\n              \"samples\": [\n                \"tomato juice\",\n                \"spaghetti\",\n                \"chocolate\"],\n            \"semantic_type\": \"\",\n            \"description\": \"\",\n            \"column\": 6,\n            \"properties\": {\n              \"dtype\": \"category\",\n              \"num_unique_values\": 103,\n              \"samples\": [\n                \"champagne\",\n                \"chili\",\n                \"protein bar\"],\n            \"semantic_type\": \"\",\n            \"description\": \"\",\n            \"column\": 7,\n            \"properties\": {\n              \"dtype\": \"category\",\n              \"num_unique_values\": 99,\n              \"samples\": [\n                \"black tea\",\n                \"tea\",\n                \"body spray\"],\n            \"semantic_type\": \"\",\n            \"description\": \"\",\n            \"column\": 8,\n            \"properties\": {\n              \"dtype\": \"category\",\n              \"num_unique_values\": 89,\n              \"samples\": [\n                \"sparkling water\",\n                \"asparagus\",\n                \"salmon\"],\n            \"semantic_type\": \"\",\n            \"description\": \"\",\n            \"column\": 9,\n            \"properties\": {\n              \"dtype\": \"category\",\n              \"num_unique_values\": 81,\n              \"samples\": [\n                \"fromage blanc\",\n                \"tomato juice\",\n                \"muffins\"],\n            \"semantic_type\": \"\",\n            \"description\": \"\"}\n          }\n        }\n      }\n    ]\n  }\n}
```

```

n    },\n    {\n        \"column\": 10,\n        \"properties\": {\n            \"dtype\": \"category\",\n            \"num_unique_values\": 67,\n            \"samples\": [\n                \"gums\",\n                \"chocolate\",\n                \"pancakes\"\n            ],\n            \"semantic_type\": \"\",\n            \"description\": \"\"\n        },\n        {\n            \"column\": 11,\n            \"properties\": {\n                \"dtype\": \"category\",\n                \"num_unique_values\": 51,\n                \"samples\": [\n                    \"strong cheese\",\n                    \"green grapes\",\n                    \"cooking oil\"\n                ],\n                \"semantic_type\": \"\",\n                \"description\": \"\"\n            },\n            {\n                \"column\": 12,\n                \"properties\": {\n                    \"dtype\": \"category\",\n                    \"num_unique_values\": 44,\n                    \"samples\": [\n                        \"asparagus\",\n                        \"cooking oil\",\n                        \"burger sauce\"\n                    ],\n                    \"semantic_type\": \"\",\n                    \"description\": \"\"\n                },\n                {\n                    \"column\": 13,\n                    \"properties\": {\n                        \"dtype\": \"category\",\n                        \"num_unique_values\": 29,\n                        \"samples\": [\n                            \"cookies\",\n                            \"frozen smoothie\",\n                            \"muffins\"\n                        ],\n                        \"semantic_type\": \"\",\n                        \"description\": \"\"\n                    },\n                    {\n                        \"column\": 14,\n                        \"properties\": {\n                            \"dtype\": \"category\",\n                            \"num_unique_values\": 20,\n                            \"samples\": [\n                                \"mineral water\",\n                                \"yogurt cake\",\n                                \"low fat yogurt\"\n                            ],\n                            \"semantic_type\": \"\",\n                            \"description\": \"\"\n                        },\n                        {\n                            \"column\": 15,\n                            \"properties\": {\n                                \"dtype\": \"category\",\n                                \"num_unique_values\": 9,\n                                \"samples\": [\n                                    \"protein bar\",\n                                    0,\n                                    \"cake\"\n                                ],\n                                \"semantic_type\": \"\",\n                                \"description\": \"\"\n                            },\n                            {\n                                \"column\": 16,\n                                \"properties\": {\n                                    \"dtype\": \"category\",\n                                    \"num_unique_values\": 4,\n                                    \"samples\": [\n                                        0,\n                                        \"french fries\",\n                                        \"antioxydant juice\"\n                                    ],\n                                    \"semantic_type\": \"\",\n                                    \"description\": \"\"\n                                },\n                                {\n                                    \"column\": 17,\n                                    \"properties\": {\n                                        \"dtype\": \"category\",\n                                        \"num_unique_values\": 4,\n                                        \"samples\": [\n                                            0,\n                                            \"spinach\",\n                                            \"frozen smoothie\"\n                                        ],\n                                        \"semantic_type\": \"\",\n                                        \"description\": \"\"\n                                    },\n                                    {\n                                        \"column\": 18,\n                                        \"properties\": {\n                                            \"dtype\": \"category\",\n                                            \"num_unique_values\": 4,\n                                            \"samples\": [\n                                                0,\n                                                \"cereals\",\n                                                \"spinach\"\n                                            ],\n                                            \"semantic_type\": \"\",\n                                            \"description\": \"\"\n                                        },\n                                        {\n                                            \"column\": 19,\n                                            \"properties\": {\n                                                \"dtype\": \"category\",\n                                                \"num_unique_values\": 2,\n                                                \"samples\": [\n                                                    0,\n                                                    \"olive oil\"\n                                                ],\n                                                \"semantic_type\": \"\",\n                                                \"description\": \"\"\n                                            }\n                                        }\n                                    }\n                                ],\n                                \"type\": \"dataframe\", \"variable_name\": \"data\"}

```

```

# Step 6: Prepare the transactions list
transactions = []

```

```

for i in range(0, 7501):
    transactions.append([str(data.values[i,j]) for j in range(0, 20)])

# transactions list
transactions[0]

['shrimp',
 'almonds',
 'avocado',
 'vegetables mix',
 'green grapes',
 'whole weat flour',
 'yams',
 'cottage cheese',
 'energy drink',
 'tomato juice',
 'low fat yogurt',
 'green tea',
 'honey',
 'salad',
 'mineral water',
 'salmon',
 'antioxydant juice',
 'frozen smoothie',
 'spinach',
 'olive oil']

rule_list = apriori(transactions, min_support = 0.003, min_lift = 3,
min_length = 2)

rule_list

<generator object apriori at 0x7d48e44360a0>

print("Association Rules with Antecedents, Consequents, Lift, and
Support:\n")

max_rules_to_print = 10
rules_printed = 0

for rule in Results:
    for ordered_statistics in rule.ordered_statistics:
        antecedent = list(ordered_statistics.items_base)
        consequent = list(ordered_statistics.items_add)
        support = rule.support
        lift = ordered_statistics.lift

        print(f"Antecedent: {antecedent}, Consequent: {consequent},
Support: {support:.4f}, Lift: {lift:.4f}")

        rules_printed += 1

```

```

        if rules_printed >= max_rules_to_print:
            break

    if rules_printed >= max_rules_to_print:
        break

```

Association Rules with Antecedents, Consequents, Lift, and Support:

```

Antecedent: ['brownies'], Consequent: ['cottage cheese'], Support:
0.0035, Lift: 3.2253
Antecedent: ['cottage cheese'], Consequent: ['brownies'], Support:
0.0035, Lift: 3.2253
Antecedent: ['chicken'], Consequent: ['light cream'], Support: 0.0045,
Lift: 4.8440
Antecedent: ['light cream'], Consequent: ['chicken'], Support: 0.0045,
Lift: 4.8440
Antecedent: ['escalope'], Consequent: ['mushroom cream sauce'],
Support: 0.0057, Lift: 3.7908
Antecedent: ['mushroom cream sauce'], Consequent: ['escalope'],
Support: 0.0057, Lift: 3.7908
Antecedent: ['escalope'], Consequent: ['pasta'], Support: 0.0059,
Lift: 4.7008
Antecedent: ['pasta'], Consequent: ['escalope'], Support: 0.0059,
Lift: 4.7008
Antecedent: ['fresh bread'], Consequent: ['tomato juice'], Support:
0.0043, Lift: 3.2594
Antecedent: ['tomato juice'], Consequent: ['fresh bread'], Support:
0.0043, Lift: 3.2594

```

```
Results = list(rule_list)
```

```
print(f"Number of rules: {len(Results)}")
```

Number of rules: 188

```
results = pd.DataFrame(Results)
results.head()
```

```

{"summary": "{\n  \"name\": \"results\",\n  \"rows\": 188,\n  \"fields\": [\n    {\n      \"column\": \"items\",\n      \"properties\": {\n        \"dtype\": \"string\",\n        \"num_unique_values\": 188,\n        \"samples\": [\n          \"frozenset({'mineral water', '0', 'spaghetti', 'pancakes', 'ground beef'})\",\n          \"frozenset({'0', 'spaghetti', 'frozen vegetables', 'milk', 'chocolate'})\",\n          \"frozenset({'fromage blanc', '0', 'honey'})\",\n          ],\n          \"semantic_type\": \"\",\n          \"description\": \"\",\n          },\n          {\n            \"column\": \"support\",\n            \"properties\": {\n              \"dtype\": \"number\",\n              \"std\": 0.001768423204432923,\n              \"min\": 0.0030662578322890282,\n              \"max\": 0.015997866951073192,\n              \"num_unique_values\": 27,\n              \"samples\": [\n

```

```
0.005332622317024397,\n          0.0030662578322890282,\n0.003199573390214638\n],\n  \"semantic_type\": \"\",\n  \"description\": \"\",\n  }},\n  {\n    \"column\":\n  \"ordered_statistics\",\n  \"properties\": {\n    \"dtype\":\n  \"object\",\n  \"semantic_type\": \"\",\n  \"description\": \"\"\n  }\n  ]\n  },\n  \"type\": \"dataframe\", \"variable_name\": \"results\"}
```