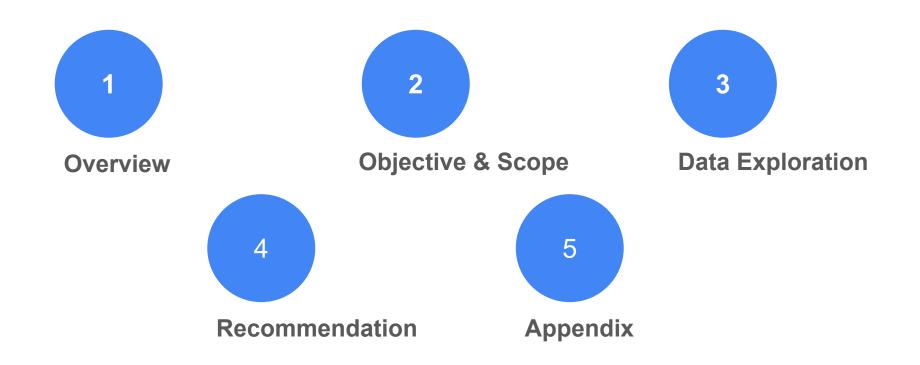


Table Of Contents





Executive Summary

Objective

Analyzing performance from 2015, identify key trends, so it can help **PPS Pizza** to increase the sales

Analysis

To increase sales in early 2017, utilize market basket analysis

Recommendation

Created discounted pizza bundles

Profile

PPS Pizza is a pizza restaurant that focused on serving a variety of high quality pizzas. Offering delicious pizza options in various size and types

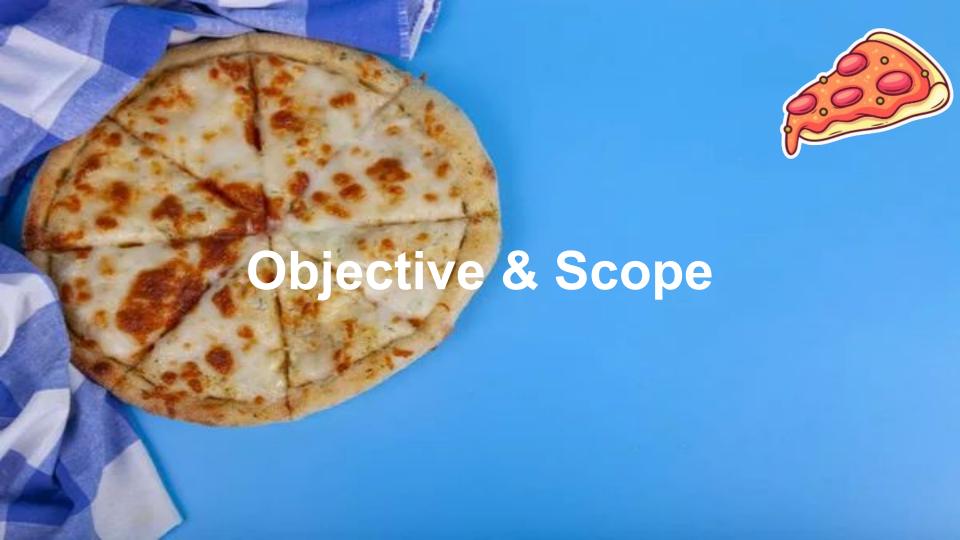
Background



How to increase the sales by **10%** in next early 2017?

Company Overview





Objective & Scope

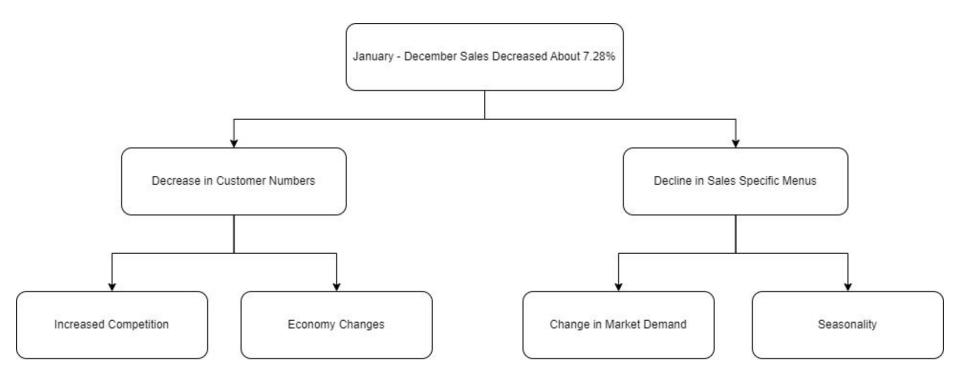
Objective

How to increase the sales by **8-10%** in next early 2017?

Scope

Using data from 2015, which encompassing a year's worth of sales

Root Cause



Methodology

Design

- Define the objective and scope
- Define Hypothesis

Conduct

- Using pizza place sales data from <u>Maven Analytics</u>
- Conducting data gathering and data cleaning using python and visualizing it in power bi

Synthesize

- Analyzing the data using python
- Summarize and interpret the result

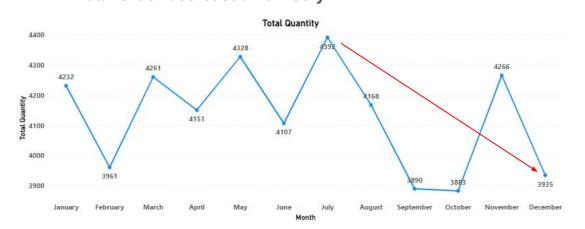


AOV experienced increase



The **AOV** increased from \$37.83 in January to \$38.51 in December, about 1.78%.

Total Order decreased from July



Total **order decreased** from **4301** in January to **3935** in December, about **10.27%**.

Daily Customer



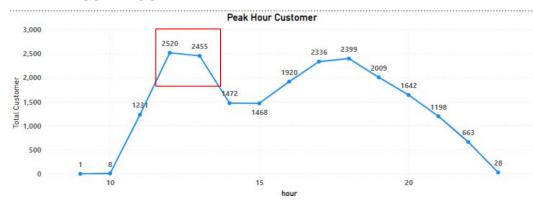
There are 60 Daily Customer.

From July, customer keep decrease



Starting from **July**, the number of customer **decreased about 13.19%.**

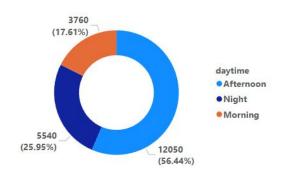
Peak Hour



The **busiest hour** is in **12** and **1PM**.

Most Customer come in afternoon

Total Customer



About **56.44%** customer come in afternoon.

Decrease in July



Decrease on **July**, the **total order** and **total quantity**.

A Increase in **Weekday** contrasted with **Weekend Decline**



Friday is the busiest day with 8106 order, while Sunday is the least busy day with only 5917 order.

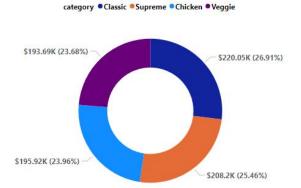
Classic category has generated the highest sales and quantity

Pizza Category	Total Order	Total Quantity	Total Sales
Classic	14579	14888	\$220,053
Supreme	11777	11987	\$208,197
Chicken	10815	11050	\$195,919.5
Veggie	11499	11649	\$193,690.45

From July, sales decreased



The **sales decline** from **July** to **December**, with the **Veggie** category showing the worst performance.



Total Sales by Category

The **Classic** category experienced the highest **sales** gain.

The most **order** is in the 'L size'



'L' size has the highest number of orders, accounting for **38.09**% of the total order.

We might consider removing the 'XL' and 'XXL' sizes due to fewer orders, or we could focus on the 'L', 'M', and 'S' sizes instead.

The Thai Chicken Pizza generates the highest sales and The Brie Carre Pizza has the lowest sales and quantity



The Thai Chicken Pizza contributes 5.3% of the total sales.

We could focus on serving the **top 5** menus.

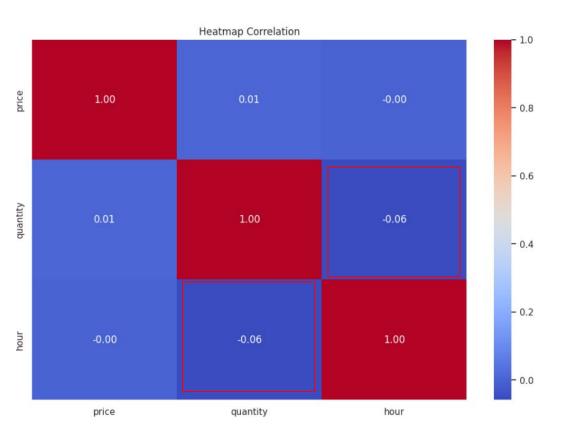
The Thai Chicken Pizza generates the highest sales and The Brie Carre Pizza has the lowest sales and quantity



The Brie Carre Pizza contributes 1.47% of the total sales.

We could consider to removing the menu or adding a promotion.

Correlation negative relationship between hour and quantity



- The value of the correlation between hour and quantity indicates a week negative relationship.
- It show that as the night progresses, the quantity of pizza order tends to decrease with very weak relationship.

Insight Summary

- The total **sales** gain is **\$817,860**
- The **sales** from **January** to **December** is **decreasing** about **7.28%**.
- There are **60** daily customer, and **Average customer order** pizza is 2
- The total order is 48,620 and quantity sold is 49,574
- Start from **July**, the number of **customer decrease** about **13.19%**
- About 56.44% customer come in afternoon
- Sales increased steadily from Monday through Friday, but decline over the weekend
- Friday is the busiest day with 8106 order, while Sunday is the least busy day with only 5917 order
- Classic Pizza category has the highest sales and quantity
- Customer prefer 'L-Size' pizza
- The Thai Chicken Pizza is the top and The Brie Carre Pizza worst



Recommendation

Creating bundles of combination pizzas at a discounted price can be a solution to address the issue of decreasing sales

Offering combination pizza bundles at discounted prices can **incentivize customers to make larger purchases**, as they perceive greater value in their order. This strategy not only encourages customers to buy more pizzas at once, but also prompts them to **explore different menu variations**. By leveraging the bundles offers instead of individual, businesses can effectively boost customer interest and drive sales.

Recommendation

Top Pizza

- (The HawaiianPizza) ->(The Thai ChickenPizza)
- (The Big MeatPizza) ->(The Sicilian Pizza)
- (The Thai Chicken Pizza) -> (The Big Meat Pizza)

Top/Mid and Mid/Mid Pizza

- (The Hawaiian Pizza)(The Mexicana Pizza)
- (The Vegetables + Vegetables Pizza) -> (The Italian Supreme Pizza)
- (The Greek Pizza) -> (The Four Cheese Pizza)

Top/Less and Mid/Less Pizza

- (The Brie Carre Pizza) -> (The Barbecue Chicken Pizza)
- (The ItalianVegetables Pizza)-> (The FourCheese Pizza)
- (The Chicken Pesto Pizza) -> (The Classic Deluxe Pizza)



Appendix

Pizza Bundling

name	quantity	name	quantity
The Classic Deluxe Pizza	2453	The Spinach and Feta Pizza	1446
The Barbecue Chicken Pizza	2432	The Pepper Salami Pizza	1446
The Hawaiian Pizza	2422	The Italian Capocollo Pizza	1438
The Pepperoni Pizza	2418	The Greek Pizza	1420
The Thai Chicken Pizza	2371	The Five Cheese Pizza	1409
The California Chicken Pizza	2370	The Pepperoni, Mushroom, and Peppers Pizza	1359
The Sicilian Pizza	1938	The Green Garden Pizza	997
The Spicy Italian Pizza	1924	The Chicken Alfredo Pizza	987
The Southwest Chicken Pizza	1917	The Italian Vegetables Pizza	981
The Big Meat Pizza	1914	The Chicken Pesto Pizza	973
The Four Cheese Pizza	1902	The Spinach Pesto Pizza	970
The Italian Supreme Pizza	1884	The Soppressata Pizza	961
The Vegetables + Vegetables Pizza	1526	The Spinach Supreme Pizza	950
The Mexicana Pizza	1484	The Calabrese Pizza	937
The Napolitana Pizza	1464	The Mediterranean Pizza	934
The Prosciutto and Arugula Pizza	1457	The Brie Carre Pizza	490

Total Pizza Quantity sold

Using min_support = 0.01 (First 10)

Find Pizza Bundling for each recommendation with lift > 1

antecedents	consequents	antecedent support	consequent support	support	confidence	lift	leverage	conviction	zhangs_metric
(The Hawaiian Pizza)	(The Thai Chicken Pizza)	0.140752	0.141136	0.020721	0.147219	1.043103	0.000856	1.007134	0.048091
(The Thai Chicken Pizza)	(The Hawaiian Pizza)	0.141136	0.140752	0.020721	0.146819	1.043103	0.000856	1.007111	0.048112
(The Barbecue Chicken Pizza)	(The Pepperoni Pizza)	0.142671	0.146508	0.020645	0.144701	0.987669	-0.000258	0.997888	-0.014354
(The Pepperoni Pizza)	(The Barbecue Chicken Pizza)	0.146508	0.142671	0.020645	0.140911	0.987669	-0.000258	0.997952	-0.014417

Using min_support = 0.02 (First 30)

Find Pizza Bundling for each recommendation with lift > 1

antecedents	consequents	antecedent support	consequent support	support	confidence	lift	leverage	conviction	zhangs_metric
(The Mexicana Pizza)	(The Hawaiian Pizza)	0.091481	0.140752	0.014812	0.161913	1.150340	0.001936	1.025249	0.143851
(The Hawaiian Pizza)	(The Mexicana Pizza)	0.140752	0.091481	0.014812	0,105234	1.150340	0.001936	1.015371	0.152100
(The Italian Supreme Pizza)	(The Vegetables + Vegetables Pizza)	0.112049	0.092325	0.011742	0.104795	1.135056	0.001397	1,013929	0.134001
(The Vegetables + Vegetables Pizza)	(The Italian Supreme Pizza)	0.092325	0.112049	0.011742	0.127182	1.135056	0.001397	1.017338	0.131089
(The Greek Pizza)	(The Four Cheese Pizza)	0.085418	0.114965	0.011128	0.130279	1.133197	0.001308	1.017607	0.128519
(The Pepper Salami Pizza)	(The Italian Supreme Pizza)	0.087030	0.112049	0.010975	0.126102	1.125420	0.001223	1.016081	0.122066
(The Big Meat Pizza)	(The Sicilian Pizza)	0.114505	0.113507	0.014582	0.127346	1.121918	0.001585	1.015858	0.122721
(The Sicilian Pizza)	(The Big Meat Pizza)	0.113507	0.114505	0.014582	0.128465	1.121918	0.001585	1.016018	0.122583
(The Italian Capocollo Pizza)	(The Sicilian Pizza)	0.088642	0.113507	0.011205	0.126407	1.113646	0.001143	1.014766	0.111974
(The Sicilian Pizza)	(The Spicy Italian Pizza)	0.113507	0.112817	0.014121	0.124408	1.102749	0.001316	1.013239	0.105106
(The Spicy Italian Pizza)	(The Sicilian Pizza)	0.112817	0.113507	0.014121	0.125170	1.102749	0.001316	1.013331	0.105024
(The Spinach and Feta Pizza)	(The Pepperoni Pizza)	0.089025	0.146508	0.014351	0.161207	1.100328	0.001309	1.017524	0.100091
(The Mexicana Pizza)	(The Italian Supreme Pizza)	0.091481	0.112049	0.011205	0.122483	1.093121	0.000955	1.011890	0.093766
(The Italian Supreme Pizza)	(The Mexicana Pizza)	0.112049	0.091481	0.011205	0.100000	1.093121	0.000955	1.009465	0.095938
(The Southwest Chicken Pizza)	(The Spicy Italian Pizza)	0.115196	0.112817	0.014198	0.123251	1.092492	0.001202	1.011901	0.095684

Using min_support = 0.02 Find Pizza Bundling for each recommendation with lift > 1

(The Thai Chicken Pizza)	(The Big Meat Pizza)	0.141136	0.114505	0.017038	0.120718	1.054258	0.000877	1.007066	0.05992
(The Prosciutto and Arugula Pizza)	(The Italian Supreme Pizza)	0.088642	0.112049	0.010514	0.118615	1.058596	0,000582	1.007449	0.06073
(The Five Cheese Pizza)	(The Thai Chicken Pizza)	0.085649	0.141136	0.012893	0.150538	1.066615	0.000805	1,011068	0.06830
(The Four Cheese Pizza)	(The Pepperoni Pizza)	0.114965	0.146508	0.018035	0.156876	1.070766	0.001192	1.012297	0.07467
(The Pepperoni Pizza)	(The Four Cheese Pizza)	0.146508	0.114965	0.018035	0.123101	1.070766	0.001192	1.009278	0.07743
(The Italian Supreme Pizza)	(The Four Cheese Pizza)	0.112049	0.114965	0.013814	0.123288	1.072389	0,000932	1.009493	0.07602
(The Four Cheese Pizza)	(The Italian Supreme Pizza)	0.114965	0.112049	0.013814	0.120160	1.072389	0.000932	1.009219	0.07627
(The Napolitana Pizza)	(The California Chicken Pizza)	0.089870	0.138450	0.013354	0.148591	1.073248	0.000911	1.011911	0.07498
(The Italian Capocollo Pizza)	(The Big Meat Pizza)	0.088642	0.114505	0.010898	0.122944	1.073698	0.000748	1.009622	0.07531
(The Napolitana Pizza)	(The Italian Supreme Pizza)	0.089870	0.112049	0.010821	0.120410	1.074617	0.000751	1.009505	0.07629
(The Four Cheese Pizza)	(The Vegetables + Vegetables Pizza)	0.114965	0.092325	0.011512	0.100134	1.084572	0.000898	1.008677	0.08810
he Vegetables + Vegetables Pizza)	(The Four Cheese Pizza)	0.092325	0.114965	0.011512	0.124688	1.084572	0.000898	1.011108	0.08590
(The Spinach and Feta Pizza)	(The Thai Chicken Pizza)	0.089025	0.141136	0.013661	0.153448	1.087238	0.001096	1.014544	0.08808
(The Pepper Salami Pizza)	(The Sicilian Pizza)	0.087030	0.113507	0.010744	0.123457	1.087655	0.000866	1.011351	0.08827
(The Spicy Italian Pizza)	(The Southwest Chicken Pizza)	0.112817	0.115196	0.014198	0.125850	1.092492	0.001202	1.012189	0.09542

Using min_support = 0.05 (First 30)

Find Pizza Bundling for each recommendation with lift > 1

antecedents	consequents	antecedent support	consequent support	support	confidence	lift	leverage	conviction	zhangs_metric
(The Italian Vegetables Pizza)	(The Pepperoni, Mushroom, and Peppers Pizza)	0.060860	0.082732	0.006754	0.110971	1.341328	0.001719	1.031764	0.270961
(The Mediterranean Pizza)	(The Greek Pizza)	0.058250	0.085418	0.006293	0.108037	1.264798	0.001318	1.025358	0.222310
(The Italian Vegetables Pizza)	(The Four Cheese Pizza)	0.060860	0.114965	0.008519	0.139975	1.217538	0.001522	1.029080	0.190249
(The Spinach Supreme Pizza)	(The Sicilian Pizza)	0.058557	0.113507	0.008058	0.137615	1.212386	0.001412	1.027954	0.186076
(The Chicken Pesto Pizza)	(The Vegetables + Vegetables Pizza)	0.061781	0.092325	0.006907	0.111801	1.210948	0.001203	1.021927	0.185671
(The Italian Vegetables Pizza)	(The Spinach and Feta Pizza)	0.060860	0.089025	0.006370	0.104666	1.175686	0.000952	1.017469	0.159116
(The Brie Carre Pizza)	(The Barbecue Chicken Pizza)	0.030698	0.142671	0.005142	0.167500	1.174032	0.000762	1.029825	0.152929
(The Italian Vegetables Pizza)	(The Big Meat Pizza)	0.060860	0.114505	0.008135	0.133670	1.167369	0.001166	1.022122	0.152664
(The Hawaiian Pizza)	(The Mexicana Pizza)	0.140752	0.091481	0.014812	0.105234	1.150340	0.001936	1.015371	0.152100
(The Mexicana Pizza)	(The Hawaiian Pizza)	0.091481	0.140752	0.014812	0.161913	1.150340	0.001936	1.025249	0.143851
(The Chicken Alfredo Pizza)	(The Mexicana Pizza)	0.060399	0.091481	0.006293	0.104193	1.138957	0.000768	1.014190	0.129846
(The Italian Vegetables Pizza)	(The Italian Capocollo Pizza)	0.060860	0.088642	0.006140	0.100883	1.138097	0.000745	1.013615	0.129203
he Vegetables + Vegetables Pizza)	(The Italian Supreme Pizza)	0.092325	0.112049	0.011742	0.127182	1.135056	0.001397	1.017338	0.131089
(The Italian Supreme Pizza)	(The Vegetables + Vegetables Pizza)	0.112049	0.092325	0.011742	0.104795	1.135056	0.001397	1.013929	0.134001
(The Greek Pizza)	(The Four Cheese Pizza)	0.085418	0.114965	0.011128	0.130279	1.133197	0.001308	1.017607	0.128519

Using min_support = 0.05 (First 30)

Find Pizza Bundling for each recommendation with lift > 1

(The Chicken Alfredo Pizza)	(The Vegetables + Vegetables Pizza)	0.060399	0.092325 0.006293	0.104193 1.128542	0.000717	1.013248	0.121223
(The Mediterranean Pizza)	(The Vegetables + Vegetables Pizza)	0.058250	0.092325 0.006063	0.104084 1.127364	0.000685	1.013125	0.119963
(The Pepper Salami Pizza)	(The Italian Supreme Pizza)	0.087030	0.112049 0.010975	0.126102 1.125420	0.001223	1.016081	0.122066
(The Sicilian Pizza)	(The Big Meat Pizza)	0.113507	0.114505 0.014582	0.128465 1.121918	0.001585	1.016018	0.122583
(The Big Meat Pizza)	(The Sicilian Pizza)	0.114505	0.113507 0.014582	0.127346 1.121918	0.001585	1.015858	0.122721
(The Green Garden Pizza)	(The Spicy Italian Pizza)	0.062164	0.112817 0.007828	0.125926 1.116201	0.000815	1.014998	0.111004
(The Italian Capocollo Pizza)	(The Sicilian Pizza)	0.088642	0.113507 0.011205	0.126407 1.113646	0.001143	1.014766	0.111974
(The Chicken Pesto Pizza)	(The Classic Deluxe Pizza)	0.061781	0.146278 0.009977	0.161491 1.104000	0.000940	1.018143	0.100406
(The Sicilian Pizza)	(The Spicy Italian Pizza)	0.113507	0.112817 0.014121	0.124408 1.102749	0.001316	1.013239	0.105106
(The Spicy Italian Pizza)	(The Sicilian Pizza)	0.112817	0.113507 0.014121	0.125170 1.102749	0.001316	1.013331	0.105024
The Spinach and Feta Pizza)	(The Pepperoni Pizza)	0.089025	0.146508 0.014351	0.161207 1.100328	0.001309	1.017524	0.100091
(The Greek Pizza)	(The Mexicana Pizza)	0.085418	0.091481 0.008596	0.100629 1.099996	0.000781	1.010171	0.099396
(The Chicken Alfredo Pizza)	(The Four Cheese Pizza)	0.060399	0.114965 0.007598	0.125794 1.094191	0.000654	1.012387	0.091616
(The Mexicana Pizza)	(The Italian Supreme Pizza)	0.091481	0.112049 0.011205	0.122483 1.093121	0.000955	1.011890	0.093766
(The Italian Supreme Pizza)	(The Mexicana Pizza)	0.112049	0.091481 0.011205	0.100000 1.093121	0.000955	1.009465	0.095938

Pizza Bundling (Top)

Find the Pizza that only in Top based on quantity sold

consequents	support	confidence	lift
(The Thai Chicken Pizza)	0.020721	0.147219	1.043103
(The Hawaiian Pizza)	0.020721	0.146819	1.043103
(The Pepperoni Pizza)	0.020645	0.144701	0.987669
(The Barbecue Chicken Pizza)	0.020645	0.140911	0.987669
	(The Thai Chicken Pizza) (The Hawaiian Pizza) (The Pepperoni Pizza)	(The Thai Chicken Pizza) 0.020721 (The Hawaiian Pizza) 0.020721 (The Pepperoni Pizza) 0.020645	(The Thai Chicken Pizza) 0.020721 0.147219 (The Hawaiian Pizza) 0.020721 0.146819 (The Pepperoni Pizza) 0.020645 0.144701

Using min_support = 0.01

Choose (The Hawaiian Pizza) -> (The Thai Chicken Pizza) only because the lift is above 1

antecedents	consequents
(The Big Meat Pizza)	(The Sicilian Pizza)
(The Sicilian Pizza)	(The Big Meat Pizza)

support	confidence	lift
0,113507	0.014582	0.127346
0.114505	0.014582	0.128465

Using min_support = 0.02

antecedent	consequents	support	confidence	lift
(The Thai Chicken Pizza	(The Big Meat Pizza)	0.017038	0.120718	1.054258

Pizza Bundling (Top/Mid or Mid/Mid)

Find the Pizza that only in Top/Mid or Mid/Mid based on quantity sold

antecedents	consequents	support	confidence	lift
(The Mexicana Pizza)	(The Hawaiian Pizza)	0.014812	0.161913	1.150340
(The Vegetables + Vegetables Pizza)	(The Italian Supreme Pizza)	0.011742	0.127182	1.135056
(The Greek Pizza)	(The Four Cheese Pizza)	0.011128	0.130279	1.133197

Using min_support = 0.02

Pizza Bundling (Top/Less or Mid/Less)

Find the Pizza that only in **Top/Less** or **Mid/Less** based on **quantity sold**

antecedents	consequents	support	confidence	lift
(The Brie Carre Pizza)	(The Barbecue Chicken Pizza)	0.005142	0.167500	1.174032
(The Italian Vegetables Pizza)	(The Four Cheese Pizza)	0.008519	0.139975	1.217538
(The Chicken Pesto Pizza)	(The Classic Deluxe Pizza)	0.009977	0.161491	1.104000

Using min_support = 0.05

Link

Google Collab

Power BI

