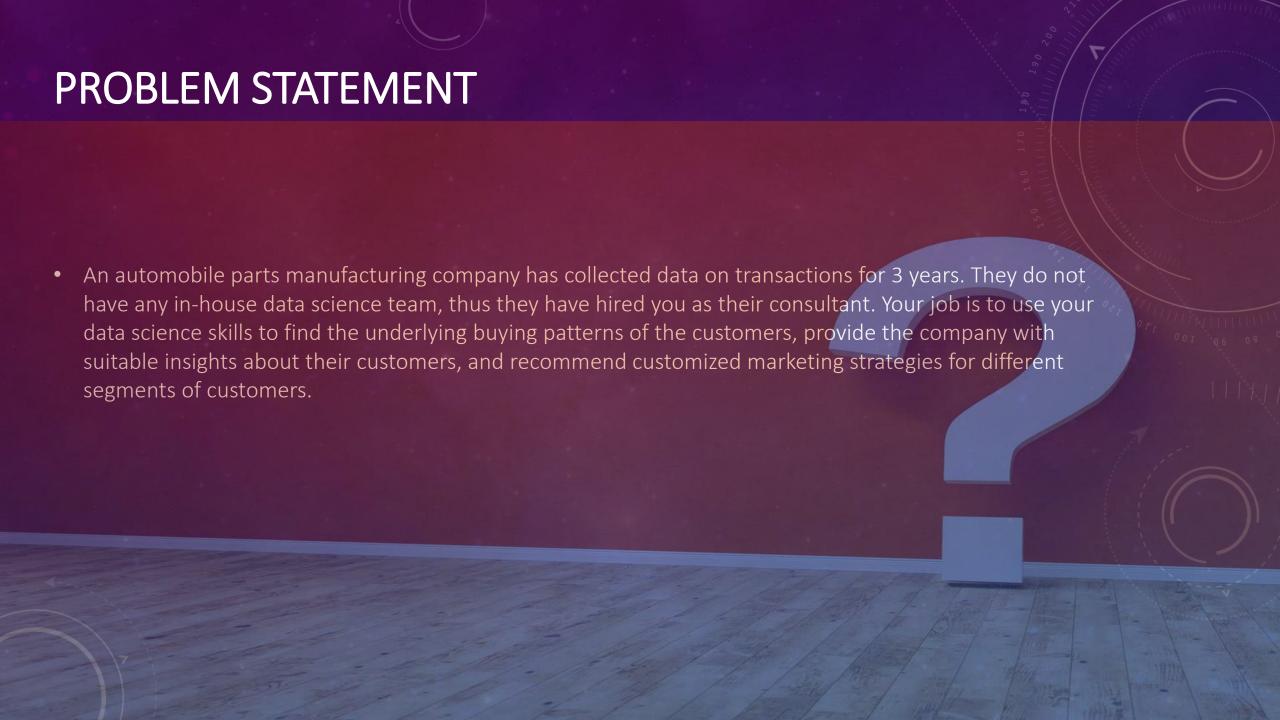


# **CONTENT**

- 1. Agenda and Executive Summary of the Data
- 2. Exploratory Analysis and Inferences
- 3. Customer Segmentation using RFM Analysis
- 4. Inferences from RFM Analysis and Identified Segments
- 5. Recommendations

# 1. AGENDA AND EXECUTIVE SUMMARY OF THE DATA

- Problem Statement
- About Data (Info, Shape, Summary, Statistical Summary)
- Assumptions on Data



## SUMMARY OF THE DATA

- The dataset consists of 2,747 transactions made by customers of an automobile parts manufacturing company.
- The dataset consists of 20 columns, including 2 float, 5 integer, and 13 object data types, providing a diverse range of information about the transactions and customers.
- The dataset is free from duplicate entries. There are no duplicates present in the dataset.
- Customers on average ordered 35 items per transaction, with a minimum of 6 and a maximum of 97.
- The average number of days since the last order is 1,757.09, with a minimum of 42 days and a maximum of 3,562 days.
- The average Manufacturer's Suggested Retail Price (MSRP) of the products is \$100.69, with a standard deviation of \$40.11.

# STATISTICAL SUMMARY

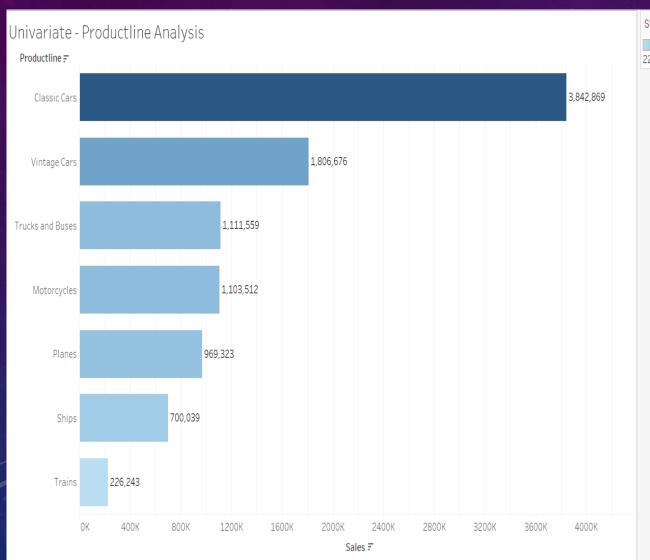
	ORDERNUMBER	QUANTITYORDERED	PRICEEACH	ORDERLINENUMBER	SALES	DAYS_SINCE_LASTORDER	MSRP
count	2747.000000	2747.000000	2747.000000	2747.000000	2747.000000	2747.000000	2747.000000
mean	10259.761558	35.103021	101.098951	6.491081	3553.047583	1757.085912	100.691664
std	91.877521	9.762135	42.042548	4.230544	1838.953901	819.280576	40.114802
min	10100.000000	6.000000	26.880000	1.000000	482.130000	42.000000	33.000000
25%	10181.000000	27.000000	68.745000	3.000000	2204.350000	1077.000000	68.000000
50%	10264.000000	35.000000	95.550000	6.000000	3184.800000	1761.000000	99.000000
75%	10334.500000	43.000000	127.100000	9.000000	4503.095000	2436.500000	124.000000
max	10425.000000	97.000000	252.870000	18.000000	14082.800000	3562.000000	214.000000

## ASSUMPTIONS ON THE DATA

- The dataset comprises information on customer orders, each uniquely identified by an ORDERNUMBER.
- It includes transactional details such as the quantity of items purchased, the time since the last order, and the Manufacturer's Suggested Retail Price (MSRP) of the products.
- Duplicate entries are absent, ensuring that each transaction record is distinct and not repeated for the same customer or transaction.



#### PRODUCT LINE ANALYSIS

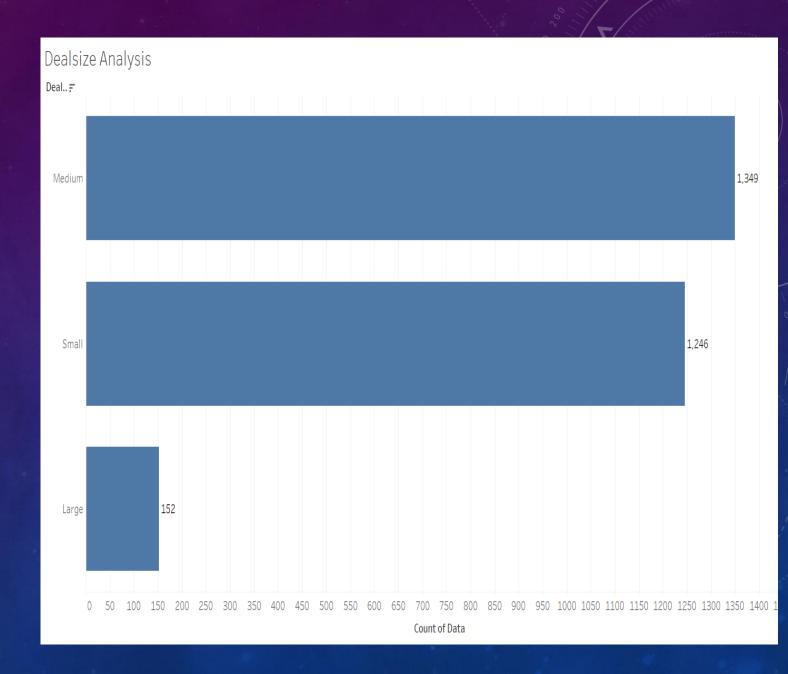




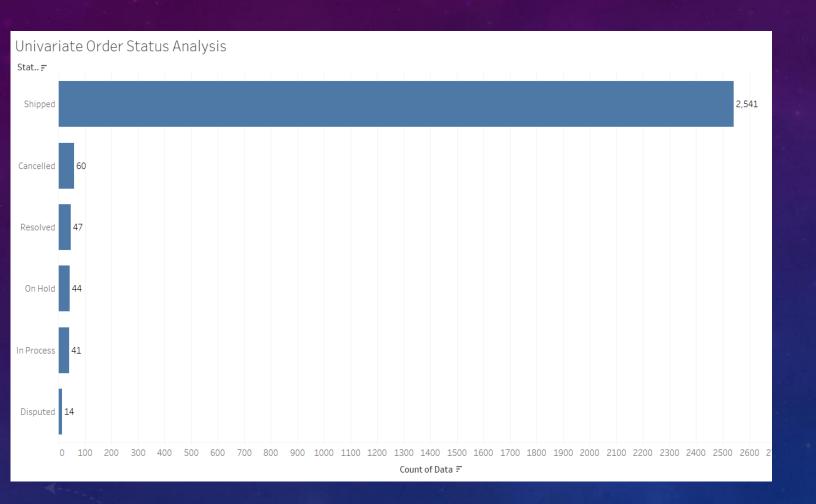
- 1. Classic cars and Vintage cars emerge as top performing product lines, indicating robust demand for these specific vehicle models among customers.
- 2. Ships, Trucks, Buses and Trains are exhibit comparatively lower counts, hinting at a niche market or specialized clientele for these products categories.

## **DEAL SIZE ANALYSIS**

- 1. The dataset reveals that the bulk of deals fall within the small and medium categories, with counts of 1246 and 1349.
- 2. The trend suggests that the company predominantly conducts transactions with moderate to smaller deal sizes, emphasizing a focus on transactions of this scale.
- 3. They should focus on large deal size as well.



## ORDER STATUS ANALYSIS

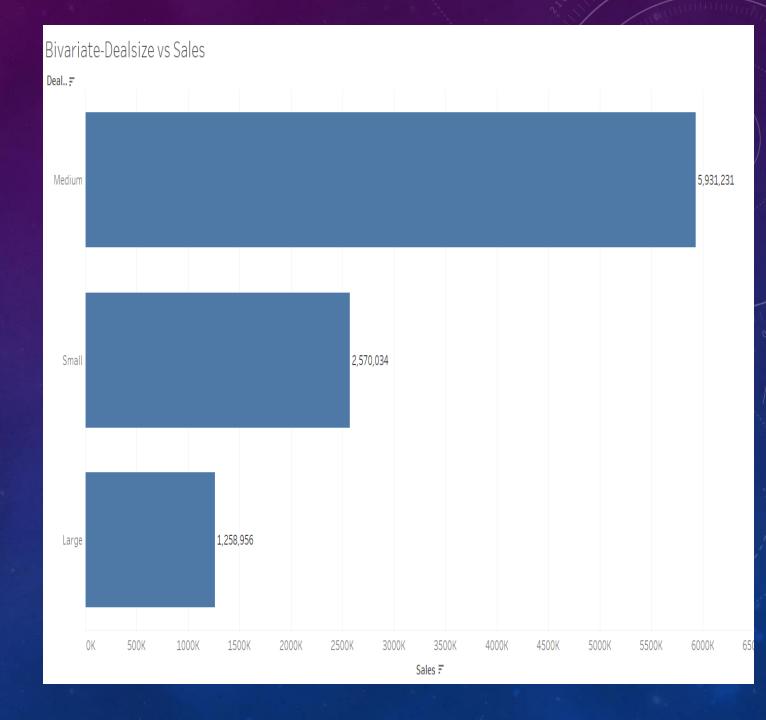


#### Inference:

 The significant count of 2,541 successfully shipped orders reflects the company's outstanding order fulfilment capabilities and commitment to delivering orders promptly

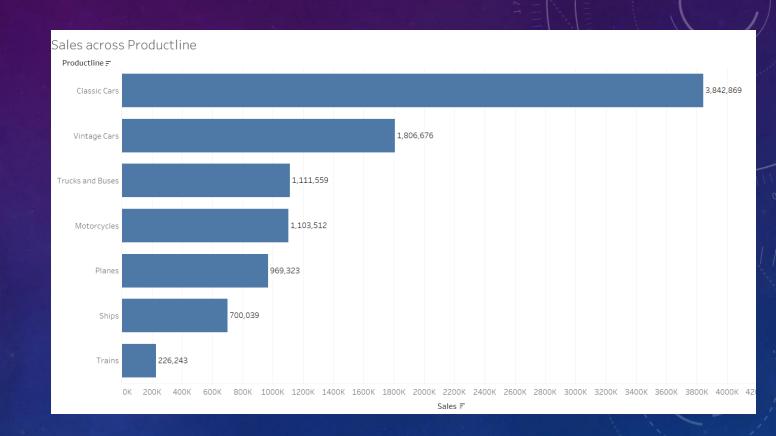
## SALES ACROSS DEAL-SIZE

- 1. Medium deal-size having highest sales of 5,931,231
- 2. Small deal-size gets the second highest sales of 2,570,034
- 3. The concern is all about the Large dealsize which is the lowest in term of sales.



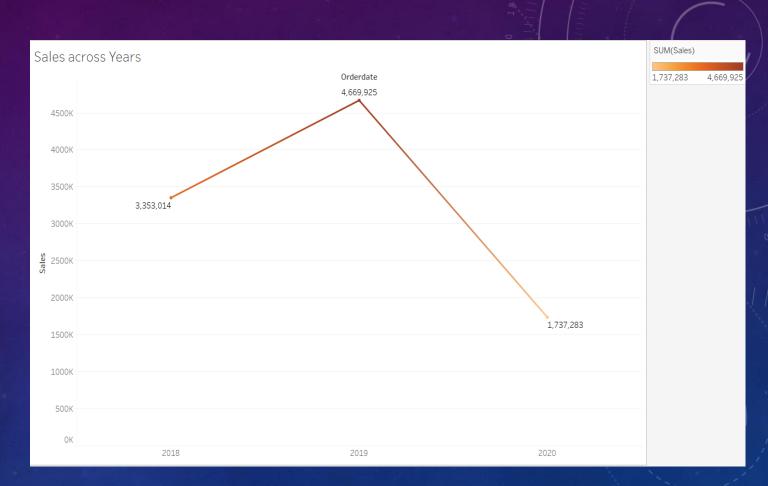
## SALES ACROSS PRODUCT LINE

- 1. Classic Cars has the highest sale of 3,842,869 whereas the Trains has the lowest sale of 226,243.
- 2. Vintage Cars also provides the good number of sales.
- 3. Company should focus on Trucks, Buses and Motorcycles. As they could gain some more sales in these product lines.
- 4. Trucks, Buses and Motorcycles should be the target of the company to increase the sales.



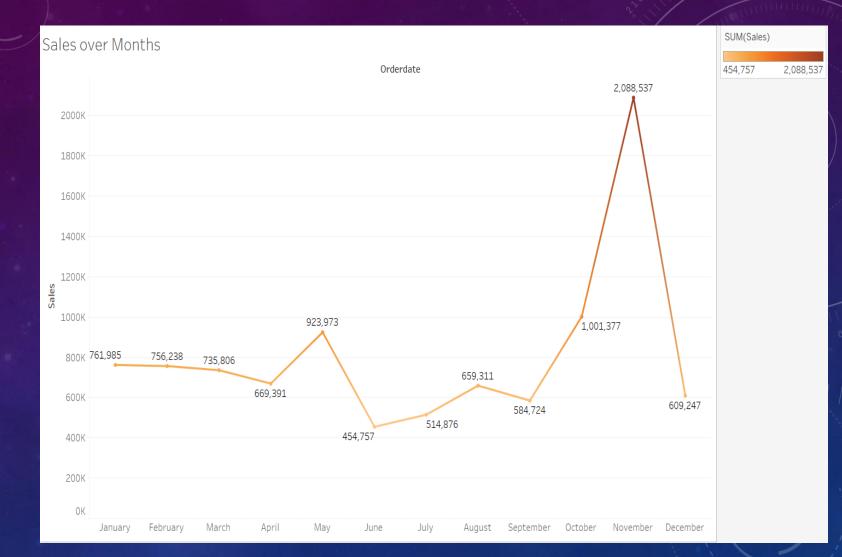
## SALES OVER YEARS

- 1. Sales showed a positive trend and grew significantly from 2018 (3,353,014) to 2019 (4,669,925), suggesting that the business performed well and experienced an increase in customer demand.
- 2. However, since we only have sales data until May for 2020 (1,737,283), it is difficult to make conclusive statements about the entire year.



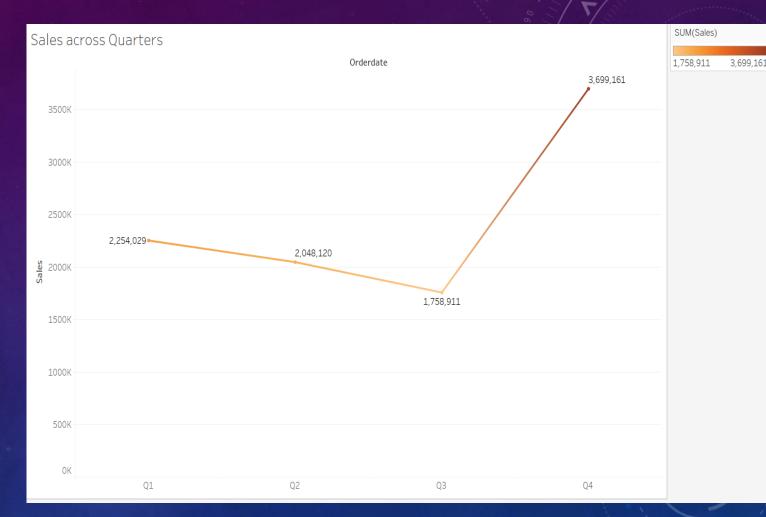
#### SALES OVER MONTHS

- 1. Sales data shows fluctuations throughout the year.
- 2. Peak sales occur in November (2,088,537) and October (1,001,377), indicating heightened customer activity likely influenced by seasonal factors.
- 3. In contrast, June records the lowest sales (454,757), suggesting a potential decrease in customer demand during that period



## SALES ACROSS QUARTERS

- 1. Quarterly sales data over three years shows a consistent pattern.
- 2. Q4 (3,699,161) consistently has higher sales compared to other quarters, indicating increased customer spending towards the end of the year.
- 3. Q1 (2,254,029) and Q2 (2,048,120) show stable sales figures.
- 4. Q3 (1,758,911) records the lowest sales among the quarters.



## SALES OVER WEEKS

#### Inference:

- 1. Throughout the three-year period, Sundays consistently recorded the highest sales, totaling 2,175,121.
- 2. This trend suggests that customers are more active and inclined to shop during weekends, possibly due to increased leisure time or preference for weekend shopping.
- 3. In contrast, Wednesdays stand out with the lowest sales among weekdays, totaling 1,374,952.
- 4. This lower sales figure on Wednesdays indicates that customers may be less engaged or influenced by factors that affect their buying behavior specifically on this day.

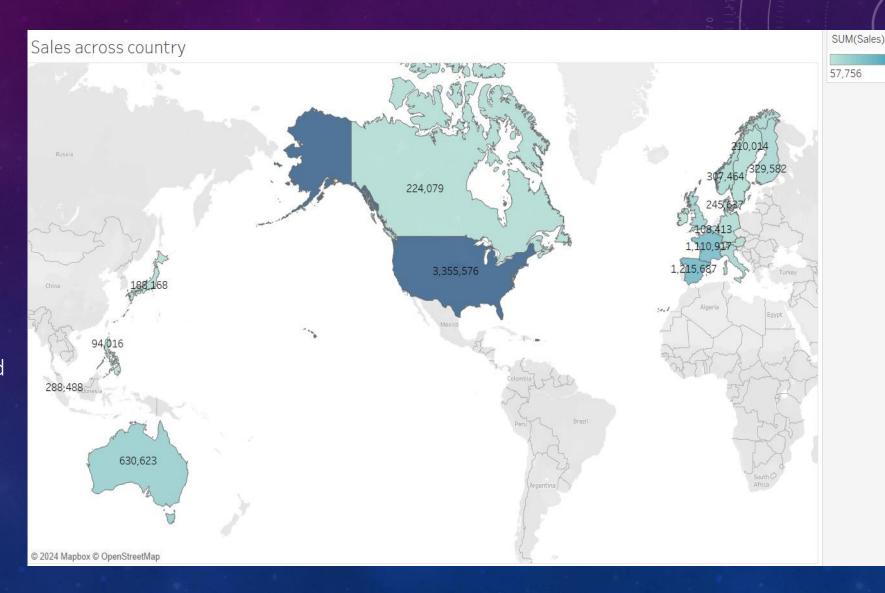


2.175.121

#### Inference:

- 1. Sales data by country reveals significant variations.
- 2. The USA leads with considerably higher sales (3,355,576), indicating a strong market presence and potentially a larger customer base.
- 3. Canada (224,079),
  Singapore (288,488),
  Denmark (245,637), and
  Finland (329,582) also
  show notable sales
  figures, highlighting
  significant market
  opportunities and
  customer demand in
  these countries.

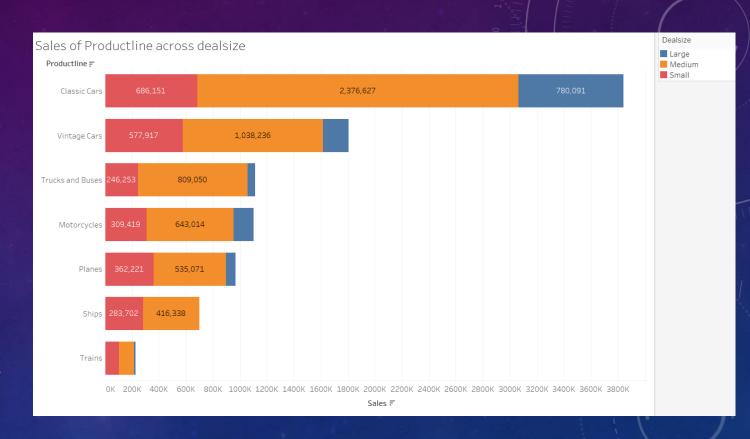
## SALES ACROSS COUNTRIES



3,355,576

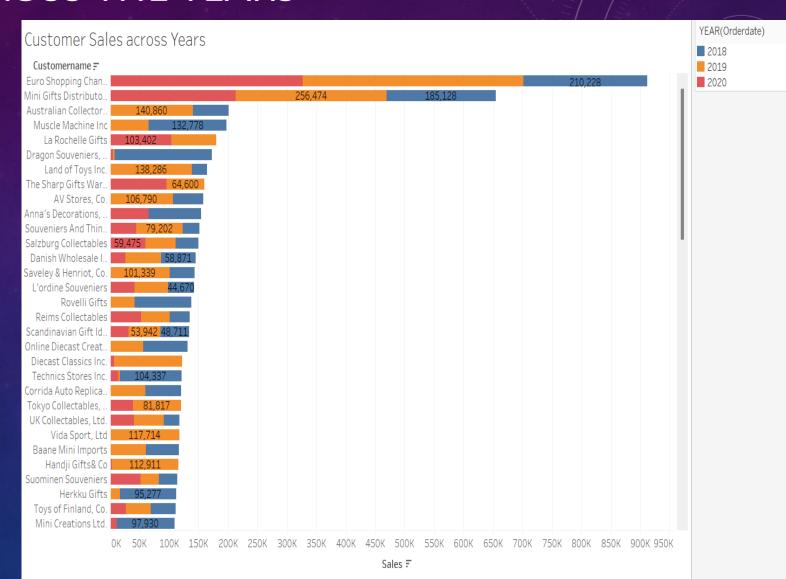
## SALES OF PRODUCT LINE ACROSS DEAL SIZE

- Graph analysis shows Classic Cars and Vintage Cars as the most frequently ordered product lines.
- 2. Motorcycles, Planes, Trucks & Buses, and Ships follow in terms of order frequency.
- 3. Trains had the lowest number of orders among the product lines.
- 4. Notably, most orders across all product lines were in the medium and small deal size categories.
- 5. Higher deal sizes were less common among the popular product lines.



#### CUSTOMERS SALES ACROSS THE YEARS

- 1. Euro Shopping Channel achieved the top sales position throughout the three-year period.
- 2. The company consistently maintained its sales performance without significant fluctuations.
- 3. Mini Gift Distributor Ltd secured the second-highest sales position.
- 4. It showcased steady and consistent sales growth over the years.
- 5. Australian Collectors Co ranked third in terms of sales.
- 6. The company did not record any sales in the year 2020, affecting its overall sales performance.
- 7. Muscle Machine Inc held the fourth position in terms of sales.
- 8. Similar to Australian Collectors Co, it also did not generate any sales in the year 2020.



#### **SUMMARY**

#### **Product Line Analysis:**

- Classic cars and vintage cars stand out as the most popular product lines, indicating a robust demand for these specific vehicle models.
- In contrast, product lines such as ships, trucks, buses, and trains have lower counts, suggesting a specialized customer base or a
  niche market for these items.

#### Deal Size Analysis:

- The majority of deals fall into the small and medium categories, with 1,246 and 1,349 counts, respectively.
- This trend indicates that the company primarily engages in transactions of moderate to smaller deal sizes rather than largescale deals.

#### Order Status Analysis:

- A significant count of 2,541 successfully shipped orders showcases the company's exceptional order fulfillment capabilities.
- This high number reflects the company's commitment to delivering orders promptly and efficiently.

#### **Quality Ordered Analysis:**

- Bins with quality orders of 21, 28, 35, and 42 have the highest counts, indicating their popularity among customers.
- With counts ranging from 576 to 631, these quantities effectively meet the demands of a substantial portion of the customer base.

#### Sales Analysis:

- Sales exhibited a positive trend, experiencing substantial growth from 2018 (3,353,014) to 2019 (4,669,925).
- This growth suggests that the business performed well and witnessed increased customer demand.
- However, the absence of complete 2020 sales data makes it challenging to draw definitive conclusions about the entire year's
  performance.

## 3. CUSTOMER SEGMENTATION USING RFM ANALYSIS

- What is RFM?
- What all parameters used, and assumptions made?
- Showcase the KNIME workflow image.
- What results are there in the output table head?

## WHAT IS RFM?

RFM analysis is a powerful customer segmentation technique widely utilized in marketing and retail industries. It involves evaluating and categorizing customers based on three key metrics:

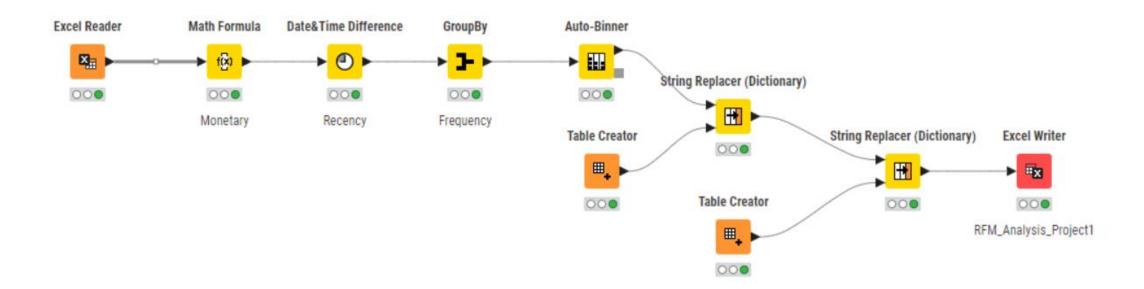
- 1.Recency: This metric assesses how recently a customer has made a purchase. Customers who have made recent purchases are often more engaged and responsive to marketing efforts.
- 2.Frequency: Frequency measures how often a customer makes purchases within a specific timeframe. Customers who make frequent purchases are typically loyal and valuable to the business.
- 3.Monetary Value: Also known as "Monetary," this metric calculates the total amount of money a customer has spent on purchases. Customers with higher monetary value are considered more profitable and contribute significantly to the company's revenue.

By analyzing these three metrics together, RFM analysis helps businesses identify and understand different customer segments, such as high-value loyal customers, potential churn risks, and new customer opportunities. This information allows companies to tailor their marketing strategies, promotions, and customer experiences to maximize engagement, retention, and profitability.

## **ASSUMPTIONS**

- Greater monetary value implies a more lucrative customer: The belief is that customers who spend more
  money on purchases are potentially more profitable and valuable for the business.
- Recent purchases serve as a better indicator of customer involvement: The notion is that customers who
  have recently made purchases are likely more engaged with the company and its products/services,
  increasing the potential for repeat business or additional sales opportunities.
- More frequent purchases indicate customer loyalty: The assumption is that customers who make
  purchases more often are more loyal to the company. They tend to have a stronger affinity for the brand,
  higher satisfaction levels, and are more likely to recommend the company to others

## KNIME WORKFLOW



# OUTPUT TABLE HEAD

Rows:	89	Column	s: 16															
	#	RowID	CUSTOM	ORDER Number (d_	QUA Number	PRIC	ORDER Local Date	COU	MSRP Number (dou	DEALSIZE	Monetary Number (dou	Recency Number (I	ORD	Mon String	Rec String	ORDER String	Monetar V	Recency [
	1	Row0	AV Stores, Co.	10,253.686	34.863	91.085	2019-10-14	UK	92.843	Medium	157,807.81	1581	Bin 2	Bin 3	Bin 2	M	Н	М
	2	Row1	Alpha Cognac	10,226.45	34.35	101.16	2018-11-08	France	97.15	Medium	70,488.44	1449	Bin 2	Bin 1	Bin 1	M	L	Н
	3	Row2	Amica Model	10,284.5	32.423	110.853	2019-08-17	Italy	107.654	Large	94,117.26	1650	Bin 2	Bin 2	Bin 3	M	М	L
	4	Row3	Anna's Decora	10,250.196	31.935	106.424	2020-03-09	Australia	104.717	Small	153,996.13	1468	Bin 2	Bin 3	Bin 2	M	Н	M
	5	Row4	Atelier graphi	10,204.714	38.571	92.239	2019-09-27	France	95.571	Medium	24,179.96	1573	Bin 1	Bin 1	Bin 2	L	L	M
	6	Row5	Australian Col	10,247.522	30.652	90.042	2018-11-21	Australia	88.13	Medium	64,591.46	1407	Bin 2	Bin 1	Bin 1	M	L	Н
	7	Row6	Australian Col	10,242.2	35.018	104.59	2019-02-20	Australia	103.527	Medium	200,995.41	1569	Bin 2	Bin 3	Bin 2	M	Н	М
	8	Row7	Australian Gift	10,248.133	36.333	110.554	2018-11-06	Australia	111.533	Large	59,469.12	1504	Bin 2	Bin 1	Bin 2	M	L	M
	9	Row8	Auto Assoc. &	10,299.111	35.389	99.488	2019-10-11	France	100.389	Large	64,834.32	1618	Bin 3	Bin 1	Bin 3	Н	L	L
	10	Row9	Auto Canal Pe	10,245.889	37.074	94.255	2019-01-15	France	94.852	Medium	93,170.66	1439	Bin 2	Bin 2	Bin 1	M	М	Н
	11	Row	Auto/Moto Cl	10,281	35.875	92.8	2018-06-16	USA	87.375	Medium	26,479.26	1565	Bin 2	Bin 1	Bin 2	M	L	M
	12	Row	Baane Mini Im	10,205.781	33.812	108.574	2019-10-15	Norway	107.469	Medium	116,599.19	1593	Bin 1	Bin 2	Bin 2	L	M	M
	13	Row	Bavarian Colle	10,296	28.643	84.289	2019-09-15	Germany	82.714	Medium	34,993.92	1644	Bin 3	Bin 1	Bin 3	Н	L	L
	14	Row	Blauer See Au	10,240.455	36.864	108.031	2018-10-04	Germany	105.818	Medium	85,171.59	1593	Bin 2	Bin 2	Bin 2	M	М	M
	15	Row	Boards & Toys	10,228	34	89.807	2020-02-08	USA	92.333	Medium	9,129.35	1498	Bin 2	Bin 1	Bin 2	M	L	M
	16	Row	CAF Imports	10,185.308	36	104.963	2019-03-19	Spain	106.923	Large	49,642.05	1824	Bin 1	Bin 1	Bin 3	L	L	L
	17	Row	Cambridge Co	10,237.545	32.455	101.329	2019-03-10	USA	97.364	Medium	36,163.62	1774	Bin 2	Bin 1	Bin 3	M	L	L
	18	Row	Canadian Gift	10,259.5	31.955	105.341	2018-12-05	Canada	106.409	Large	75,238.92	1607	Bin 2	Bin 2	Bin 2	M	М	M
	19	Row	Classic Gift Id	10,236.143	31.81	103.32	2018-11-13	USA	102.476	Medium	67,506.97	1615	Bin 2	Bin 1	Bin 2	M	L	M
	20	Row	Classic Legen	10,229.3	36	109.803	2018-10-20	USA	106.65	Medium	77,795.2	1577	Bin 2	Bin 2	Bin 2	M	М	M
	21	Row	Clover Collect	10,253.688	30.625	112.87	2019-02-12	Ireland	106.875	Large	57,756.43	1643	Bin 2	Bin 1	Bin 3	M	L	L
	22	Row	Collectable Mi	10,223.12	38.16	91.535	2019-02-19	USA	93.12	Medium	87,489.23	1845	Bin 2	Bin 2	Bin 3	M	М	L
	23	Row	Collectables F	10,247.458	33.125	97.237	2020-01-20	USA	99.458	Medium	81,577.98	1517	Bin 2	Bin 2	Bin 2	M	М	M
	24	Row	Corrida Auto	10,200.75	36.344	105.175	2018-05-28	Spain	102.625	Large	120,615.28	1597	Bin 1	Bin 3	Bin 2	L	Н	М
	25	Row	Cruz & Sons C	10,162.923	36.962	96.08	2018-03-03	Philippin	97.962	Medium	94,015.73	1582	Bin 1	Bin 2	Bin 2	L	М	М
	26	Row	Daedalus Desi	10,193.2	34.95	95.474	2018-11-11	France	94.5	Small	69,052.41	1850	Bin 1	Bin 1	Bin 3	L	L	L
	27	Row	Danish Whole	10,217.361	36.528	108.038	2018-02-11	Denmark	106.417	Large	145,041.6	1431	Bin 1	Bin 3	Bin 1	L	Н	Н
	28	Row	Diecast Classi	10,299.097	35.839	108.566	2019-11-02	USA	106.581	Medium	122,138.14	1386	Bin 3	Bin 3	Bin 1	Н	Н	Н

# 4. INFERENCES FROM RFM ANALYSIS AND IDENTIFIED SEGMENTS

- Who are your best customers?
- Which customers are on the verge of churning?
- Who are your lost customers?
- Who are your loyal customers?

## TOP 5 BEST CUSTOMERS

CUSTOMERNAME	ORDERNUMBER [Binned](H,M,L)	Monetary [Binned](H,M,L)	Recency [Binned](H,M,L)
Diecast Classics Inc.	Н	Н	Н
Euro Shopping Channel	Н	Н	н
L'ordine Souveniers	Н	Н	Н
La Rochelle Gifts	н	Н	Н
Reims Collectables	н	н	Н

H = High M = Moderate L = Low

Customers with High Recency, High Monetary and High Frequency falls under the best customers category having RFM score is greater than others.

## CUSTOMERS WHO'S ON THE VERGE OF CHURNING

CUSTOMERNAME	ORDERNUMBER [Binned](H,M,L)	Monetary [Binned](H,M,L)	Recency [Binned](H,M,L)
Amica Models & Co.	M	M	L
Collectable Mini Designs Co.	М	M	L
Marta's Replicas Co.	н	M	L
Norway Gifts By Mail, Co.	н	M	L
Royal Canadian Collectables, Ltd.	M	M	L
Super Scale Inc.	M	M	L
Vida Sport, Ltd	M	M	L

H = High
M = Moderate
L = Low

Customers with low Recency, High and Moderate Monetary and High and Moderate Frequency comes under the verge of churning.

## WHO ARE YOUR LOST CUSTOMERS?

CUSTOMERNAME	ORDERNUMBER [Binned](H,M,L)	Monetary [Binned](H,M,L)	Recency [Binned](H,M,L)
CAF Imports	L	L	L
Daedalus Designs Imports	L	L	L
Double Decker Gift Stores, Ltd	L	L	L
Iberia Gift Imports, Corp.	L	L	L
Osaka Souveniers Co.	L	L	L
Signal Collectibles Ltd.	L	L	L
West Coast Collectables Co.	L	L	L

H = High M = Moderate L = Low

Customers with Low Recency, Low Monetary and Low Frequency falls under the lost customers category.

## WHO ARE YOUR LOYAL CUSTOMERS?

CUSTOMERNAME	ORDERNUMBER [Binned](H,M,L)	Monetary [Binned](H,M,L)	Recency [Binned](H,M,L)
Diagraph Classics Inc.			
Diecast Classics Inc.	Н	Н	Н
Euro Shopping Channel	н	н	н
L'ordine Souveniers	н	н	н
La Rochelle Gifts	Н	н	н
Reims Collectables	н	н	н
Souveniers And Things Co.	Н	Н	н
The Sharp Gifts Warehouse	Н	Н	Н

Above are the top and Loyal customers. As they has solid order history or the frequency with the bulk number of orders as Monetary and having the most recent interactions with the company as Recency.

## 5. RECOMMENDATIONS

• Implement Strategies for Customer Retention:

Develop personalized initiatives such as loyalty programs, customized incentives, and exclusive promotions to maintain the engagement of customers who show signs of churning.

Utilize Continuous Monitoring and Analysis:

Consistently track customer behaviors, sales data, and key performance metrics to detect shifts in patterns and take proactive measures to address potential issues.

Leverage Upselling and Cross-Selling Opportunities:

Identify chances to upsell or cross-sell to existing customers, particularly those with significant value. Recommend relevant products or services based on their buying history to boost their overall spending and foster stronger loyalty.

