

Project: Analyzing the Impact of Car Features on Price and Profitability

OVERVIEW OF THE PROJECT AND PURPOSE OF THE PROJECT:

To analyze a dataset related to the automotive industry and use data analysis techniques such as regression analysis and market segmentation to identify the factors that drive consumer demand for cars, and how a car manufacturer can optimize pricing and product development decisions to maximize profitability while meeting consumer demand. The analysis will focus on identifying the most popular product features and market categories among consumers, as well as the most profitable ones for the manufacturer, and using this information to develop a pricing strategy that balances consumer demand with profitability. The ultimate goal is to help the manufacturer improve its competitiveness in the market and increase its profitability over time.

The purpose of this project is to help car manufacturers optimize their pricing and product development decisions by analyzing consumer demand, market categories, and product features. By identifying which features and categories are most popular among consumers and most profitable for the manufacturer, the manufacturer can develop a pricing strategy that maximizes profitability while meeting consumer demand. The ultimate goal is to improve the manufacturer's competitiveness in the market and increase its profitability over time.

The business problem or question that the project aims to address is how a car manufacturer can optimize pricing and product development decisions to maximize profitability while meeting consumer demand. The project will analyze a dataset related to the automotive industry to identify the factors that drive consumer demand for cars, such as product features and market categories, and use this information to develop a pricing strategy that balances consumer demand with profitability. The ultimate goal is to help the manufacturer improve its competitiveness in the market and increase its profitability over time.

DESCRIPTION OF THE DATASET:

overview of the dataset:

- Number of observations: 11,159
- Number of variables: 16

File type: CSV (Comma Separated Values) The variables in the dataset are: \

- Make: the make or brand of the car
- Model: the specific model of the car
- Year: the year the car was released

- Engine Fuel Type: the type of fuel used by the car (gasoline, diesel, etc.)
- Engine HP: the horsepower of the car's engine
- Engine Cylinders: the number of cylinders in the car's engine
- Transmission Type: the type of transmission (automatic or manual)
- Driven_Wheels: the type of wheels driven by the car (front, rear, all)
- Number of Doors: the number of doors the car has
- Market Category: the market category the car belongs to (Luxury, Performance, etc.)
- Vehicle Size: the size of the car
- Vehicle Style: the style of the car (Sedan, Coupe, etc.)
- Highway MPG: the estimated miles per gallon the car gets on the highway
- City MPG: the estimated miles per gallon the car gets in the city
- Popularity: a ranking of the popularity of the car (based on the number of times it has been viewed on Edmunds.com)
- MSRP: the manufacturer's suggested retail price of the car

DATA CLEANING AND PREPROCESSING STEPS:

The columns which had null values

Engine Fuel Type - 3
 Engine HP - 69
 Engine Cylinders - 30
 Number of Doors - 6
 Market Category - 3742
 Total null values - 3850

- During the data cleaning process, the rows with null values in Market Category and Engine HP were removed.
- Null values in “Number of Doors” were filled manually by the information provided on the internet
- The null values in Engine Cylinders were filled based on the assumptions
 - The number of cylinders was filled with **zero** when its corresponding value in ‘Engine Fuel Type’ was Electric
 - The number of cylinders was filled with **Four** when its corresponding value in ‘Engine Fuel Type’ was 'premium unleaded (required)' and 'regular unleaded'

APPROACH OF THIS PROJECT:

ANALYTICAL METHODS AND TECH-STACK USED IN THIS PROJECT:

- **REGRESSION ANALYSIS**
 - Regression analysis is used to identify the relationship between a dependent variable and one or more independent variables. It helps analysts to understand how changes in one variable affect another variable and to make predictions about future outcomes based on historical data.
- **STATISTICS**
 - Statistics method used to analyze data, draw conclusions from the data, and make predictions about future outcomes based on probability distributions.
- **DATA VISUALIZATION - EXCEL GRAPH**
 - Excel graphs and pivot tables are used to visualize and summarise data, making it easier to identify trends, patterns, and relationships. Graphs are used to display data visually, highlighting important patterns and trends
- **DATA SUMMARIZATION AND ANALYTICS - PIVOT TABLES**
 - pivot tables are used to summarise data and perform calculations.

CHALLENGES ENCOUNTERED DURING THIS PROJECT:

- Faced the limitations in Excel while plotting graphs in some graphs like Bubble charts, Scatter charts....etc number of data per set is unimportant but you can only display 255 series
- While filling values in the Legend series of the graph while performing the last task of building the dashboard.

KEY INSIGHTS DISCOVERED USING THIS PROJECT:

1. The identification of which car features are most popular among consumers and how they affect a car's pricing and profitability.
2. Identifying which market categories are most profitable for the manufacturer and how they affect pricing and profitability.
3. The development of a pricing strategy that balances consumer demand with profitability, based on insights from regression analysis and market segmentation.
4. The identification of trends in-car features and pricing over time could help inform product development and pricing decisions.

5. The comparison of fuel efficiency across different types of cars could inform consumer purchasing decisions and product development efforts focused on fuel efficiency.
6. The development of a model to predict the price of a car based on its features and market category, could inform pricing decisions and support sales and marketing efforts.

EXPLANATION OF THE RELATIONSHIP BETWEEN INSIGHTS AND THE BUSINESS PROBLEM:

The key insights from the analysis of the dataset are directly related to the business problem or question posed by the client, which is how a car manufacturer can optimize pricing and product development decisions to maximize profitability while meeting consumer demand.

Analyzing trends in-car features and pricing over time can help the manufacturer understand how the market has evolved and identify which features and price points have been successful in the past. This information can inform decisions about future product development and pricing strategies.

Comparing the fuel efficiency of different types of cars can help the manufacturer understand which types of cars are in demand and which types may need improvement to better meet consumer needs. This can guide decisions about product development and marketing strategies.

Investigating the relationship between a car's features and popularity can help the manufacturer understand which features are most important to consumers and which may be driving demand. This can guide decisions about product development and marketing strategies.

Predicting the price of a car based on its features and market category can help the manufacturer develop a pricing strategy that balances consumer demand with profitability. By identifying which features and categories are most profitable, the manufacturer can focus on developing and marketing those products to increase profitability.

Overall, the key insights from the analysis of the dataset can help the car manufacturer make data-driven decisions about product development, marketing, and pricing strategies that can increase profitability while meeting consumer demand.

CONCLUSIONS DRAWN FROM THE INSIGHTS

Based on the insights gained from the data analysis, the following recommendations and conclusions could be drawn for the car manufacturer:

1. Invest in alternative fuel technologies: The trend towards alternative fuel vehicles, such as electric and hybrid cars, is expected to continue. Therefore, the manufacturer could consider investing in research and development of these technologies to remain competitive in the market.
2. Focus on fuel efficiency: Consumers are increasingly concerned about fuel efficiency, and cars with better MPG ratings are likely to be more popular. The manufacturer could focus on improving the fuel efficiency of their cars to attract more customers.
3. Emphasise popular features: By analyzing the popularity variable, the manufacturer could identify which features are most popular among consumers and emphasize those features in their marketing and product development efforts.
4. Develop pricing strategy based on market category and features: By using regression analysis and market segmentation, the manufacturer could develop a pricing strategy that takes into account the market category and features of the cars, as well as consumer demand and profitability.
5. Offer customization options: By offering customization options for their cars, the manufacturer could attract more customers and increase profitability. For example, they could offer different engine power, transmission, or wheel options to cater to different customer needs and preferences.

Overall, the insights gained from the data analysis could help car manufacturers optimize their pricing and product development decisions to meet consumer demand while maximizing profitability.

RESULTS:

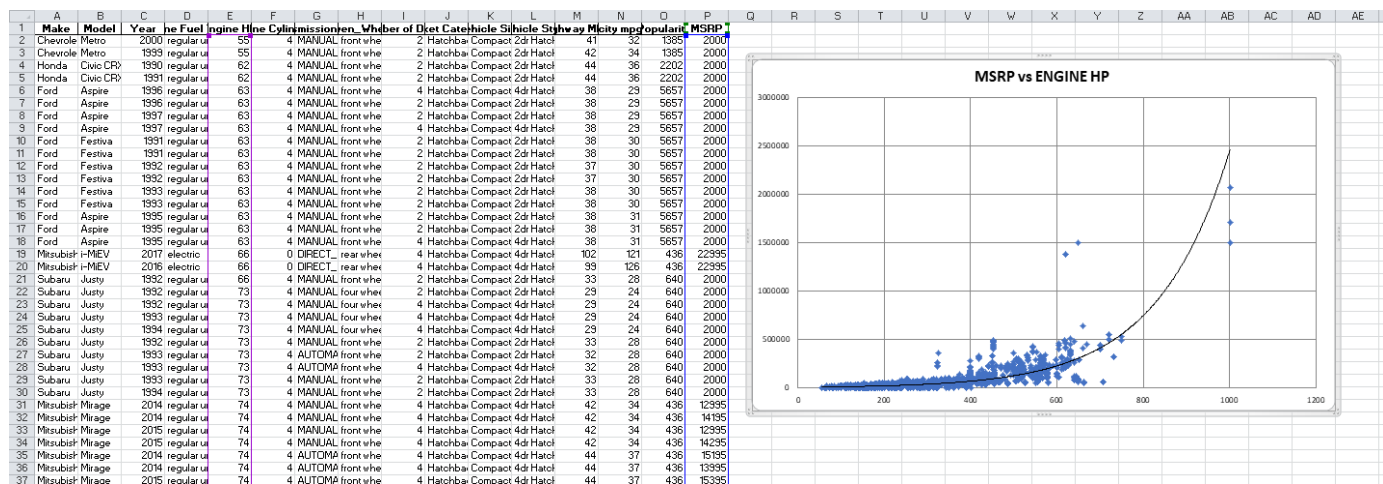
The results of this problem would likely involve identifying key factors that drive consumer demand for cars, analyzing trends in-car features and pricing over time, and developing a pricing strategy that balances consumer demand with profitability. Through data analysis techniques such as regression analysis and market segmentation, the manufacturer could gain insights into which product features are most popular among consumers and which are most profitable for the company. The analysis could also help identify opportunities for product development and innovation that would meet consumer demand while maximizing profitability. Ultimately, the results of this problem could help the manufacturer make informed decisions about pricing and product development that would improve its competitiveness in the market and increase its profitability over time.

The above screenshot has the tasks completed. The pivot table shows the number of car models in models in each market category and their corresponding popularity scores and the relationship between market category and popularity.

TASK 2

What is the relationship between a car's engine power and its price?

- Task 2: Create a scatter chart that plots engine power on the x-axis and price on the y-axis. Add a trendline to the chart to visualize the relationship between these variables.

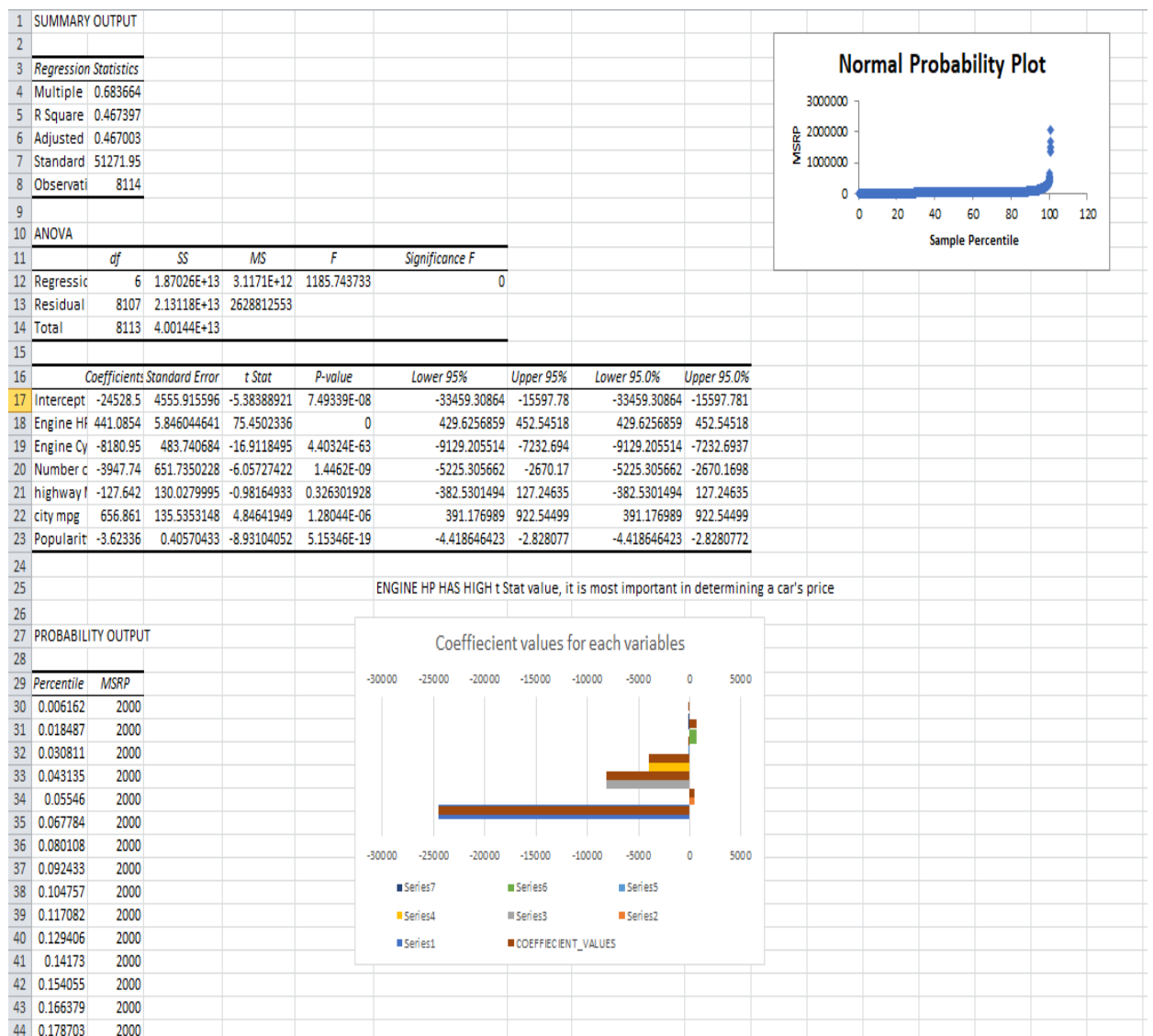


The above screenshot has the tasks completed. The scatter plot shows the relationship between Engine HP and MSRP and a trendline is added to the chart to visualize the relationship between these variables.

TASK 3:

Which car features are most important in determining a car's price? •

Use regression analysis to identify the variables that have the strongest relationship with a car's price. Then create a bar chart that shows the coefficient values for each variable to visualize their relative importance.

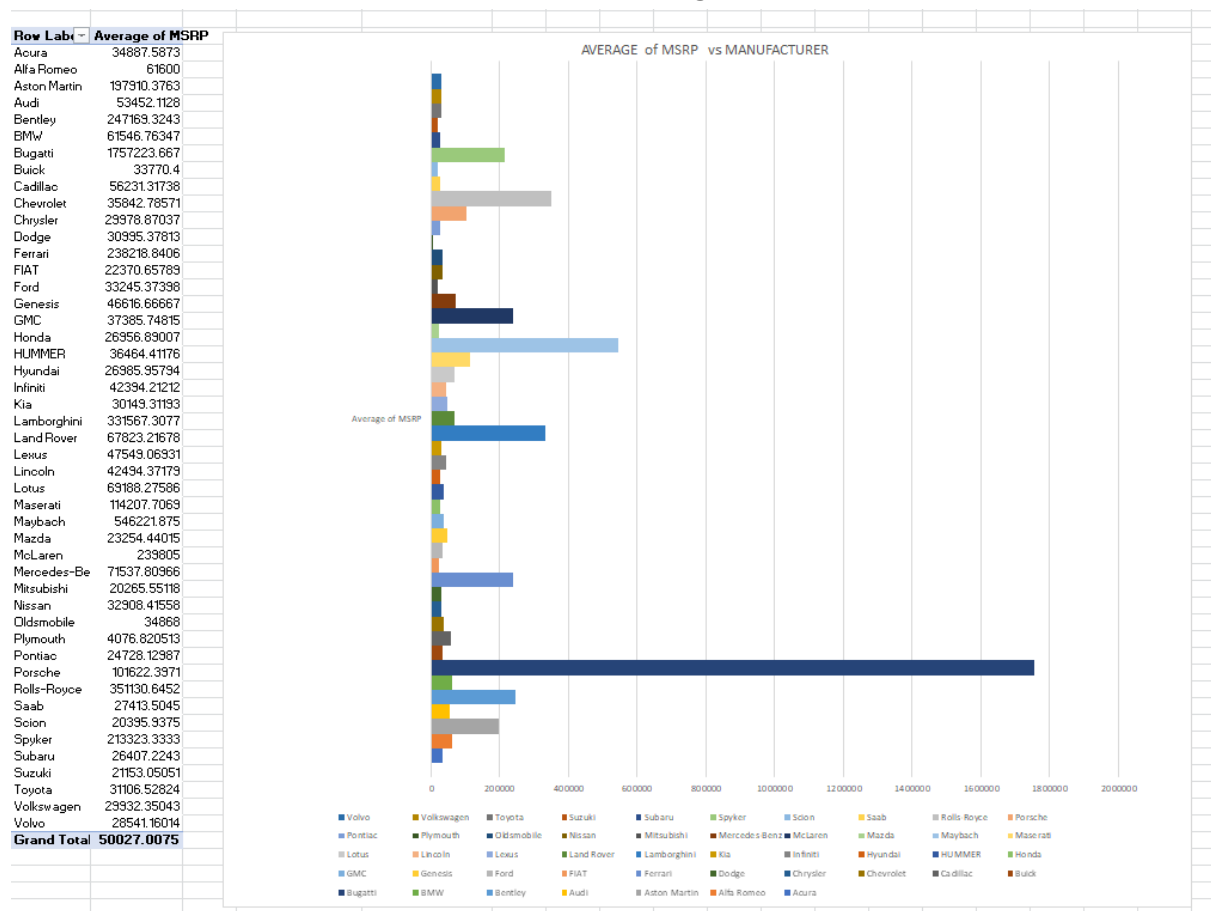


The above screenshot has the tasks completed. The strongest relationship between car price and other variables. Then the bar chart shows the coefficient values for each variable to visualize their relative importance

TASK 4:

How does the average price of a car vary across different manufacturers?

- Task 4.A: Create a pivot table that shows the average price of cars for each manufacturer.
- Task 4.B: Create a bar chart or a horizontal stacked bar chart that visualizes the relationship between the manufacturer and average price.

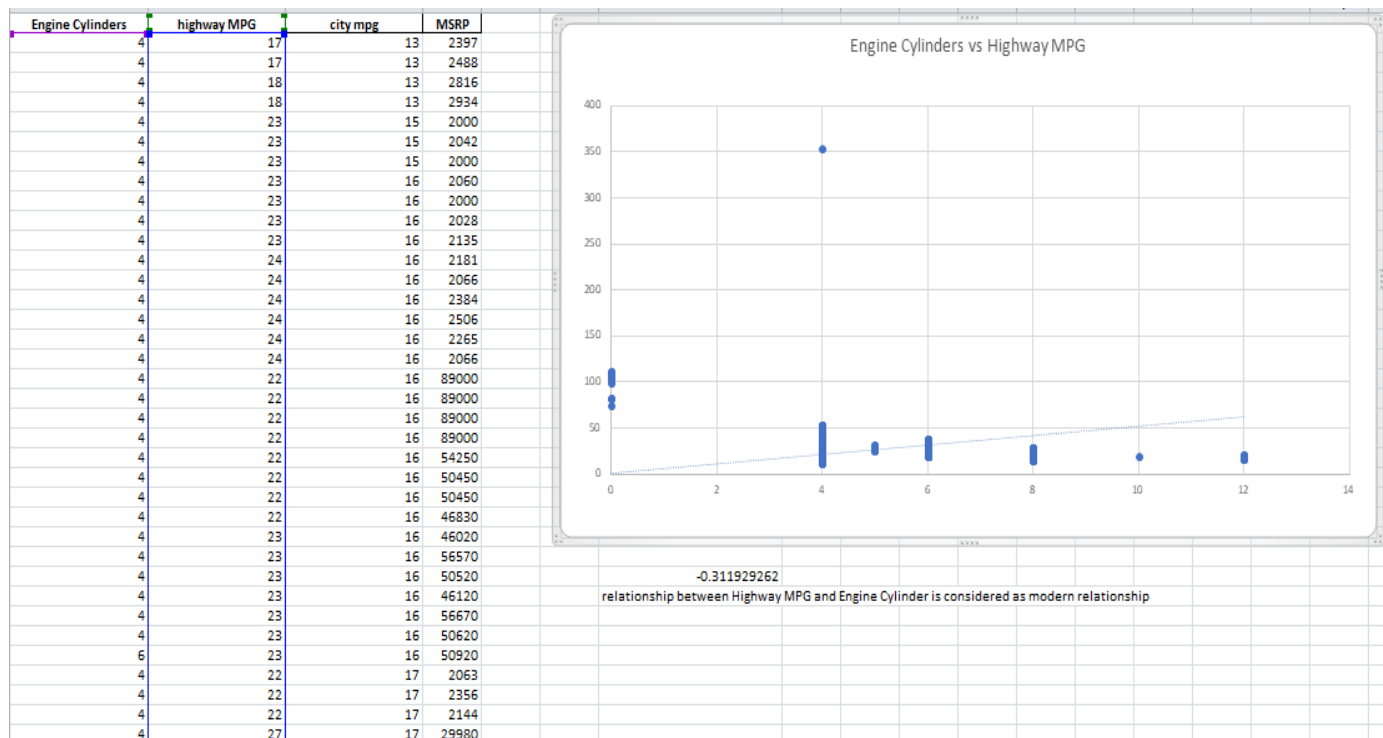


The above screenshot has the tasks completed. The pivot table shows the average price of cars for each manufacturer and the bar chart visualizes the relationship between the manufacturer and the average price.

TASK 5:

What is the relationship between fuel efficiency and the number of cylinders in a car's engine?

- **Task 5.A:** Create a scatter plot with the number of cylinders on the x-axis and highway MPG on the y-axis. Then create a trendline on the scatter plot to visually estimate the slope of the relationship and assess its significance.
- **Task 5.B:** Calculate the correlation coefficient between the number of cylinders and highway MPG to quantify the strength and direction of the relationship.

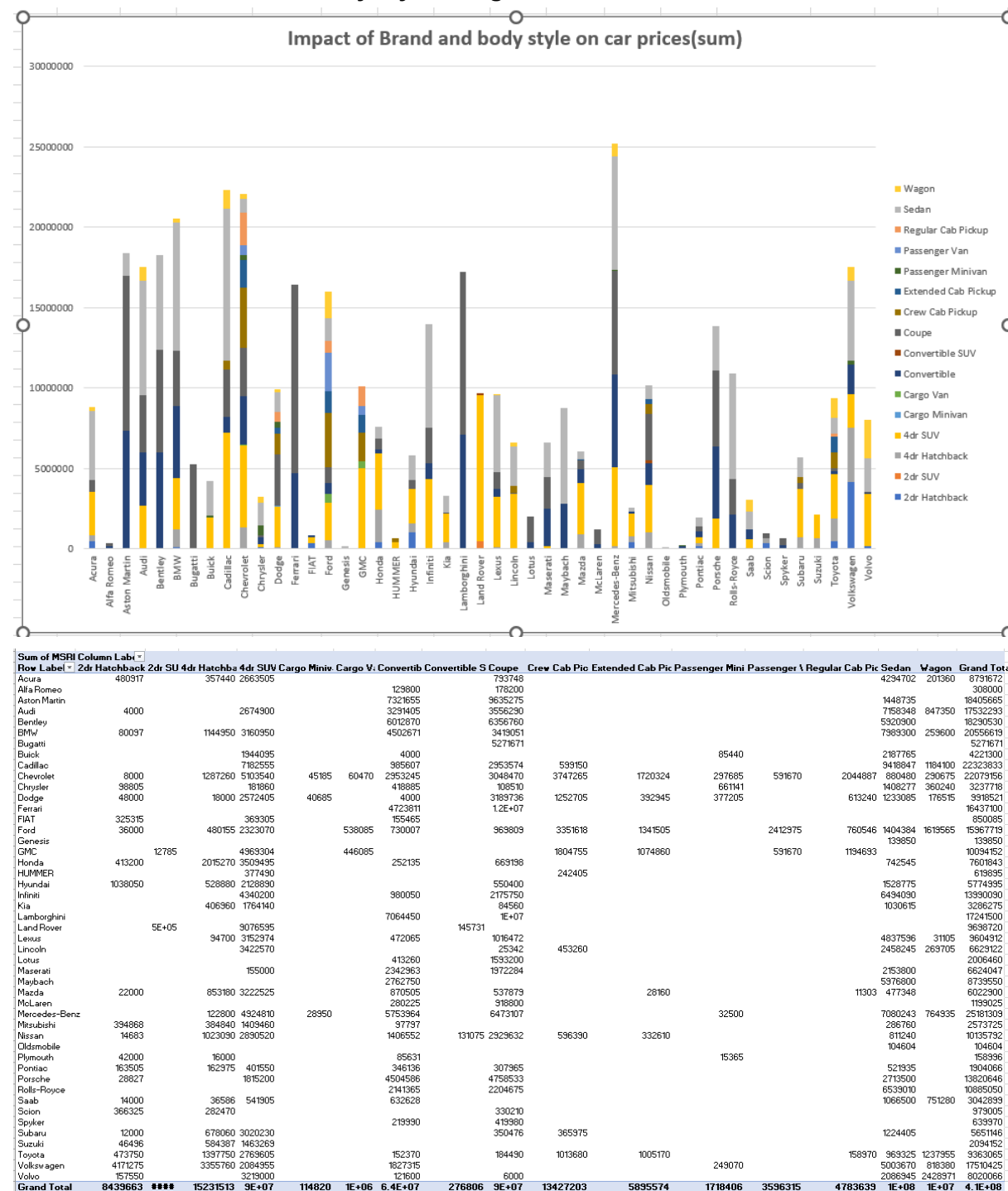


The above screenshot has the tasks completed. the scatter plot is the relationship between the number of cylinders on the x-axis and highway MPG on the y-axis and the trendline on the scatter plot to visually estimate the slope of the relationship and assess its significance. The correlation has been the number of cylinders and highway MPG is **-0.311929262** which has been mentioned in the above screenshot.

The next portion of the project i.e Building the dashboard:

Task 1: How does the distribution of car prices vary by brand and body style?

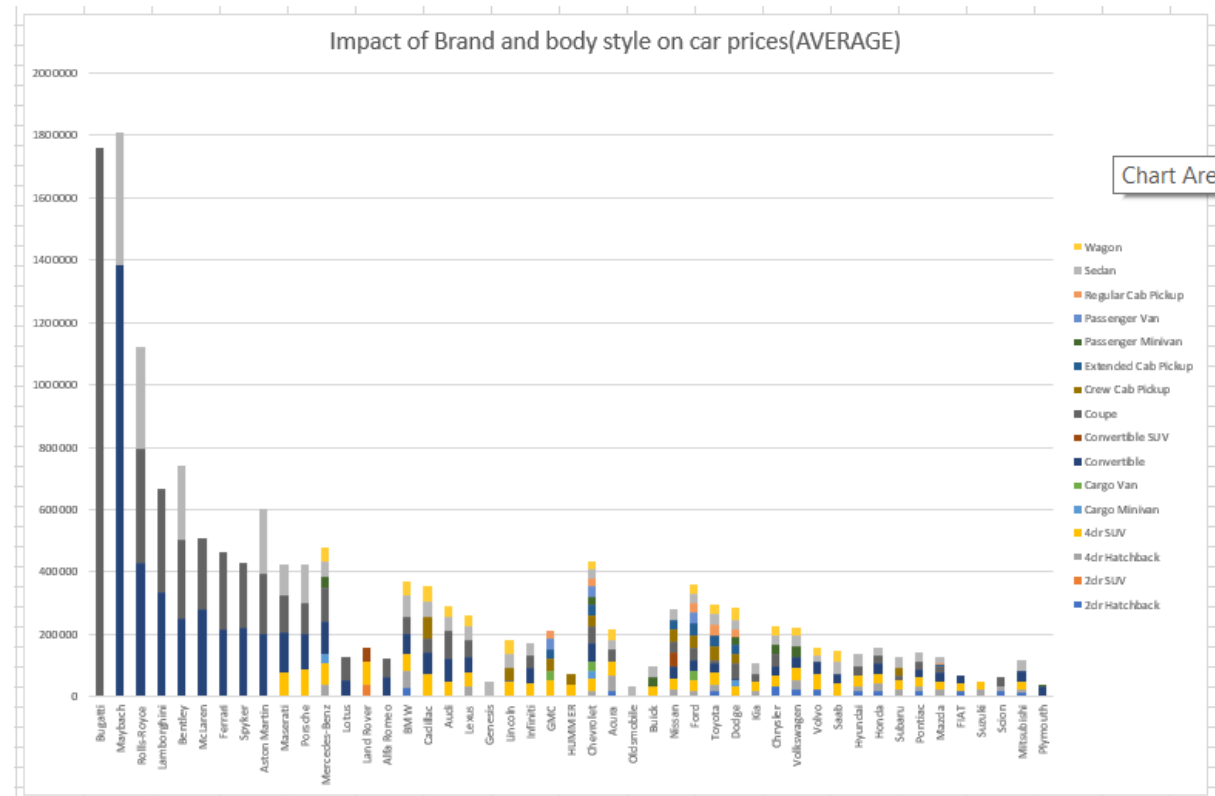
- Hints: Stacked column chart to show the distribution of car prices by brand and body style. Use filters and slicers to make the chart interactive. Calculate the total MSRP for each brand and body style using Pivot Tables.



The above graph and pivot table show the distribution of car prices by brand and body style

Task 2: Which car brands have the highest and lowest average MSRPs, and how does this vary by body style?

- Hints: Clustered column chart to compare the average MSRPs across different car brands and body styles. Calculate the average MSRP for each brand and body style using Pivot Tables.

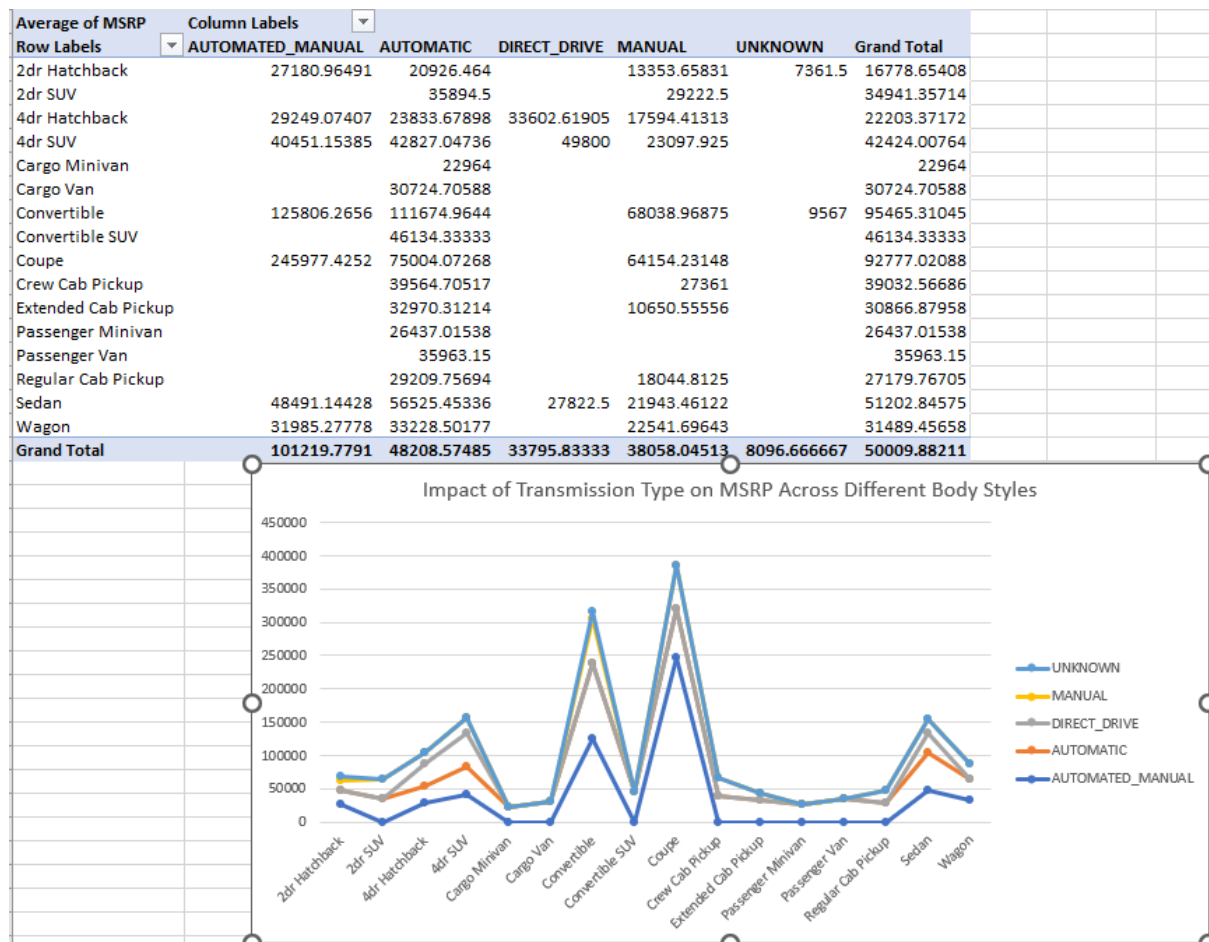


Average of MSRP by Column Labels	2dr Hatchback	2dr SUV	4dr Hatchback	4dr SUV	Cargo Minivan	Cargo Van	Convertible	Convertible SUV	Coupe	Crew Cab Pickup	Extended Cab Pickup	Passenger Minivan	Passenger Van	Regular Cab Pickup	Sedan	Wagon	Grand Total
Bugatti							1381375		1757223.67								1757223.67
Maybach							428273								426914.286		546221.875
Rolls-Royce							336402.391		367445.833						326950.5		35130.645
Lamborghini							250536.25		328291.935								331567.308
Bentley							290225		254270.4						236836		247893.324
McLaren							24718.682		229700								238905
Ferrari							219990		243218.915								238218.841
Spyker							203379.306		192705.5								213323.333
Aston Martin							130164.611		18016.706						208362.143		157910.376
Maserati				77500			115502.205		99136.1042						102561.905		114207.707
Porsche	5765.4		40933.3333	68400.1389	28950		104617.527		109713.678						123340.309		101622.397
Mercedes-Benz							51657.5		75666.6667						49168.3542	44996.1785	69168.2759
Lotus															67823.2166		67823.2166
Land Rover		33693.5		70910.8964													61600
Alfa Romeo							64900		59400								61600
BMW	26699		54521.4286	58536.1111			63417.3014		51803.803						70701.7639	43266.6667	61546.7635
Cadillac				72551.0606			70400.5		45439.6						50192.6865	47364	56231.3174
Audi	2000			48634.5455			70023.8836		3568.5789	66572.2222					44451.7888	33594	52452.1128
Lexus			31566.6667	45042.4857			52451.6667		50823.6						48864.6061	31705	47549.0633
Genesis				50331.9119					2111.83333	41205.45455					46676.6667		46676.6667
Lincoln				45686.3158			46669.0476		40291.6667						41865.1635	44950.8333	42494.3716
Infiniti				45175.4309											40598.0625		42394.2121
GMC		6392.5			31863.2143										33233.80435		37385.7481
HUMMER				37743											34623.28571		36484.4118
Chevrolet	2000		18930.2941	37804	22592.5	30235	62835	49974.918	39034.01042						24807.08333	34804.1176	20762.5
Acura	17175.60714		51062.6571	42359.7581				39687.4		30161.12281	29857.22222				33292.2636	33560	35842.7657
Oldsmobile															34868		34868
Buick				34106.9238			2000								34726.4286		33770.4
Nissan	2097.571429		22241.087	33610.6377			39070.9609	43691.66667	37083.9494	37274.375					32449.6		32449.6
Ford		2000	18467.5	34162.7941	29893.6111	34762.2381		35318.8519	42425.5443		33261				28087.68	31145.4808	32787.324
Toyota	18950		22186.5079	39565.7857		25395		13177.8571	44073.04348	37264.02778		35560.2273			34618.75	31742.4359	3106.5282
Dodge	2000		2000	30992.8313	20342.5		2000	52290.7541	29826.30952	35898.92857					32449.6053	35303	30995.3781
Kia			13373.0476	31502.5				2140		26196.33333					36807.6786		30143.3119
Chrysler	32395			36372			29920.3571	36170							27613.2745	30020	29978.8704
Volkswagen	24251.59884		27964.6667	41693.1			32058.1579								35581.42857		33357.8
Volvo	26258.33333			45338.0282			40533.3333	2000							20869.45	24785.4184	28541.1601
Saab	2000		2032.55556	41685			28755.8182								36775.8621	34143.0903	27413.5045
Hyundai	18536.60714		17629.3333	30412.7143				30577.7778							38219.375		26385.9579
Honda	17216.66667		25836.7949	23995.6838			36019.2857	22306.6							28559.4231		26956.8901
Subaru	2000		21169.375	23322.6214			24724	17523.8	24398.33333						32221.1842		26407.2243
Pontiac	18167.22222		18168.3333	25086.875				27896.8182							28996.3889		24729.1258
Mazda	2000		20809.2683	27080.042			28080.8065	22411.625			3128.888889				2825.75	23867.4	23254.4402
FIAT	19136.17647			24620.3333			25910.8333										22370.6579
Suzuki	6642.255714		16636.7778	25671.386													21653.0505
Scion	20351.98889		15632.7778						27517.5								20385.9375
Mitsubishi	13162.26667		12628	25168.9286			32599										20265.5512
Plymouth	2000		2000				28543.6667								35845		4076.82051
Grand Total	16778.65408	34941.36	22203.37	42424.01	22964	30724.71	95465.31	46194.3333	92777.02	39032.5669	30866.87958	26437.01538	35963.15	27179.76705	51202.85	31489.46	50009.88

The above graph and pivot table shows the average MSRPs across different car brands and body styles and the average MSRP for each brand and body style using Pivot Tables. The highest average MSRP is COUPE and the lowest average is 4dr Hatchback

Task 3: How do the different features such as transmission type affect the MSRP, and how does this vary by body style?

- Hints: Scatter plot chart to visualize the relationship between MSRP and transmission type, with different symbols for each body style. Calculate the average MSRP for each combination of transmission type and body style using Pivot Tables.

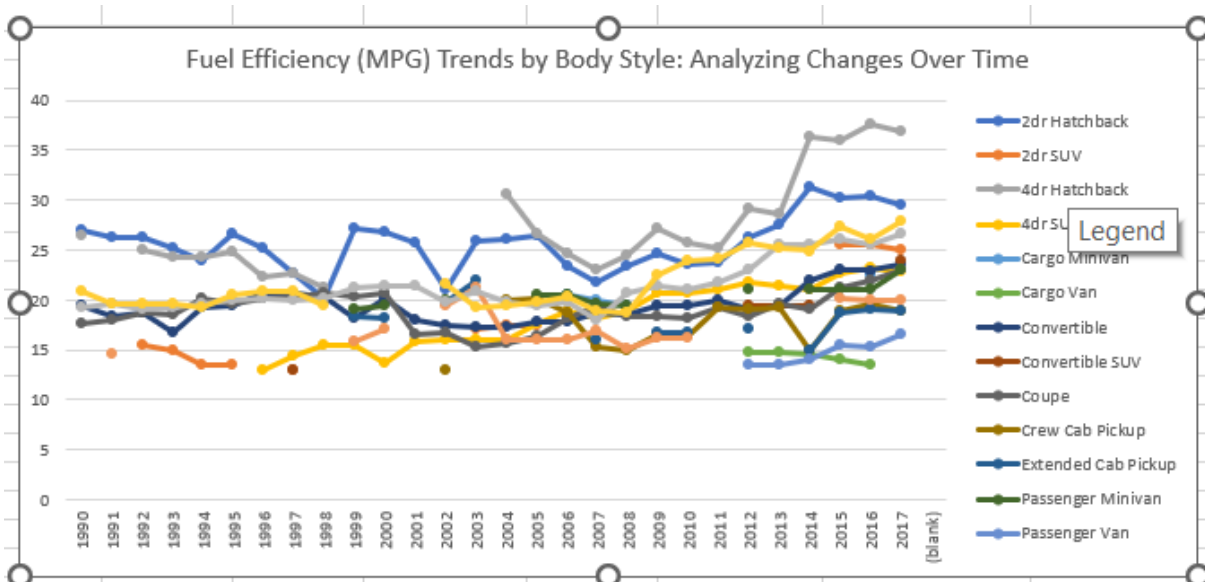


The above graph visualizes the relationship between MSRP and transmission type, with different symbols for each body style and the pivot table shows the average MSRP for each combination of transmission type and body style.

Task 4: How does the fuel efficiency of cars vary across body styles and model years?

- Hints: Line chart to show the trend of fuel efficiency (MPG) over time for each body style. Calculate the average MPG for each combination of body style and model year using AVERAGEIFS or Pivot Tables.

Average of Average MPG Column Labels														
Row Labels	2dr Hatchback	2dr SUV	4dr Hatchback	4dr SUV	Cargo Minivan	Cargo Van	Convertible	Convertible SUV Coupe	Crew Cab Pickup	Extended Cab Pickup	Passenger Minivan	Passenger Van	Regular Cab Pickup	Sedan
1990	27		26.5				19.5	17.666667						19.3125
1991	26.2						18.357143	18						14.5
1992	26.18181818	15.5	25.0625				18.666667	18.75						19.545455
1993	25.13333333	15	24.35				16.8	18.555556						19.057692
1994	23.975	13.5	24.2142857				19.25	20.166667						19.258005
1995	26.64285714	13.5	24.8333333				19.5	19.619048						19.633333
1996	25.25		22.375	13			20.175	20.6						19.970588
1997	22.72222222	13	22.65	14.3333333			20.75	20.333333	13					20.1
1998	20.2		21.25	15.5			20.333333	20.727273						19.9
1999	27.16666667			15.5			18.25	20.3						20.222222
2000	26.75		13.666667				20.2	20.666667		18.3	19			15.75
2001	25.64285714		15.857143				17.9	16.46875		18.25	19.5			17
2002	21.125		16.083333				17.5	16.692308	13	19.85714286	20			21.443368
2003	25.875	17	16				17.192308	15.222222			22			19.45454545
2004	26	17.5	30.5	16.08462			17.2	15.607143			20			19.710526
2005	26.44444444	17.5	26.7	17.7			17.727273	16.318182			20.2			21.2
2006	23.45833333		24.666667	18.903846	20.5		17.8	18.176471	18.78571429		20.5			20.941176
2007	21.73076923		23.0769231	18.244681	20		18.772727	19.425	15.34375	15.97435897	19.59090909			16
2008	23.36363636		24.5	18.8	19.5		18.578125	18.32	14.98833333		19.5			16.1930769
2009	24.625		27.2	20.694444			19.5	18.348485	16.5483871	16.66666667				16
2010	23.57692308		25.65625	20.657895			19.464286	18.175	16.4	16.75				15.125
2011	23.83333333		25.1896552	21.131944			20.029412	19.267857	19.20588235					16.875
2012	26.2173913		29.1759259	21.761905	14.666667		19.125	18.418919	19.08333333		21	13.5		15.125
2013	27.5		28.5227273	21.456522	14.666667		19.340909	19.578947	19.20588235			13.5		25.574627
2014	31.22222222		36.3571429	21.088235	14.642857		22.006944	19.5	19.052632	14.94444444		21	14.0625	25.616505
2015	30.3125	25.5	36.0785714	22.75243			21.252841	21.252841	18.90178571	18.71428571	21	15.42857143	20.21212121	25.616505
2016	30.48360656	25.5	37.5247934	23.27518	22.5	13.5	22.853445	21.946429	18.64084507		21.03571429	15.21428571	20.015625	25.544155
2017	29.43333333	25	36.9576271	22.916295			23.478873	24	22.948148	18.94897959	18.81944444	23	16.5	20.015625
(blank)														26.658147
Grand Total	27.12723658	19.642857	32.8367347	22.167144	20.5	14.441176	21.285821	19.91666667	20.299479	18.27906977	18.0890524	20.43076923	15.09	24.298062

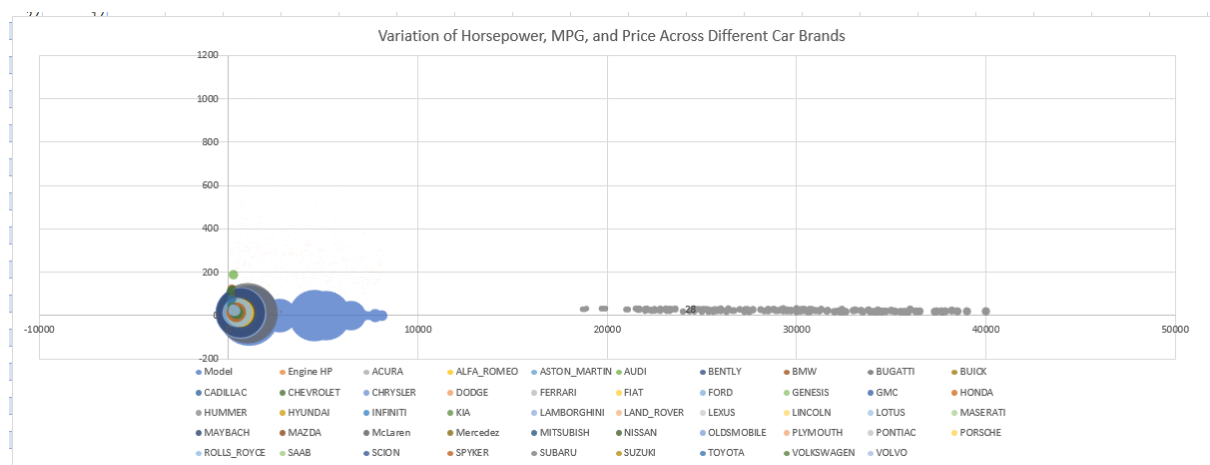


The above graph shows the fuel efficiency of cars varies across body styles and model years and the line chart shows the trend of fuel efficiency (MPG) over time for each body style. The pivot table shows the average MPG for each combination of body style and model year.

Task 5: How do the car's horsepower, MPG, and price vary across different Brands?

• Hints: Bubble chart to visualize the relationship between horsepower, MPG, and price across different car brands. Assign different colors to each brand and label the bubbles with the car model name. Calculate the average horsepower, MPG, and MSRP for each car brand using AVERAGEIFS or Pivot Tables.

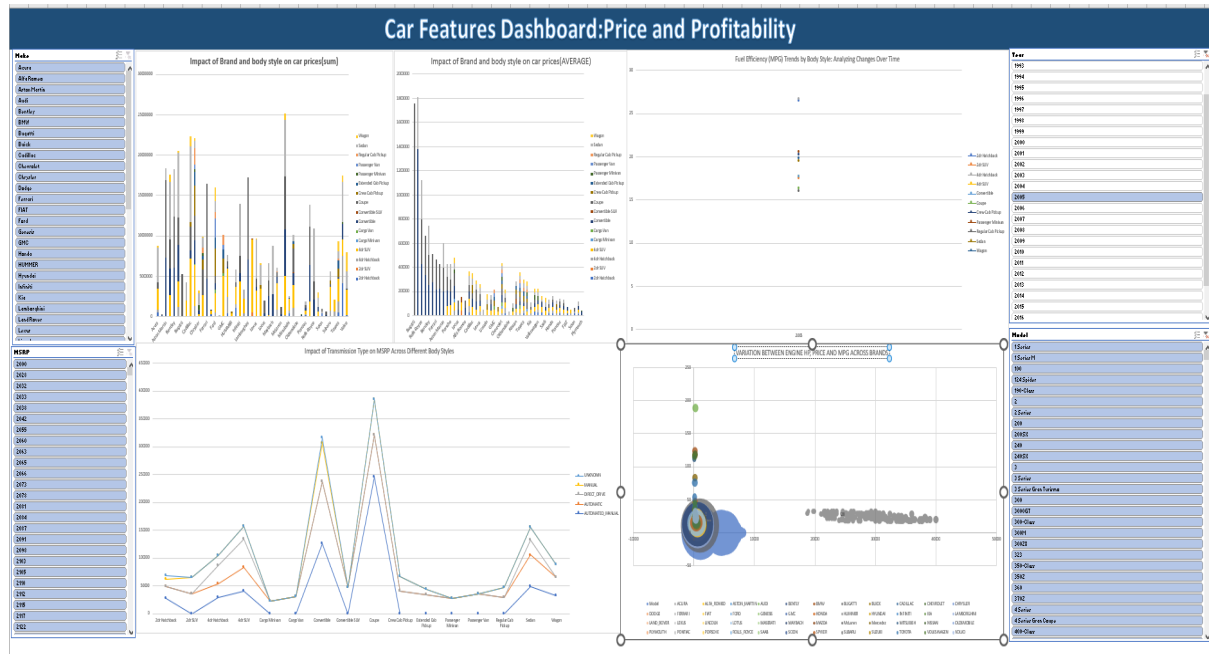
Row Labels	Average of Average MPG	Average of Engine HP	Average of MSRP				
Acura	24.02579365	244.797619	34887.5873				
CL	21.88888889	236.6666667	29818.88889	Acura	CL	27980	225
ILX	29.875	191.4375	30712.5	Acura	CL	28030	225
ILX Hybrid	38.5	111	31750	Acura	CL	30030	225
Integra	25	152.0833333	11768.58333	Acura	CL	30350	225
Legend	19.59375	215	2143.5	Acura	CL	28200	225
MDX	22.79411765	290	50332.05882	Acura	CL	32700	260
NSX	19.5	331.4	102400	Acura	CL	30550	260
RDX	23.70833333	278	39232.5	Acura	ILX	29350	201
RL	20	300	51340	Acura	ILX	31750	150
RLX	26.16666667	321.1666667	56491.66667	Acura	ILX	29350	150
RSX	26.36666667	167.4	21689	Acura	ILX	27050	150
SLX	15.25	202.5	2658.75	Acura	ILX	34890	201
TL	23.06521739	293.0434783	40876.73913	Acura	ILX	29900	201
TLX	27.64285714	266	38730	Acura	ILX	29200	201
TSX	25.46875	220.75	33284.0625	Acura	ILX	31890	201
TSX Sport Wagon	26	201	33560	Acura	ILX	32900	201
Vigor	21	176	2000	Acura	ILX	27900	201
ZDX	19.5	300	51062.85714	Acura	ILX	32990	201
Alfa Romeo	29	237	61600	Acura	ILX	29290	201
4C	29	237	61600	Acura	ILX	31980	201
Aston Martin	15.70967742	484.3225806	197910.3763	Acura	ILX	34980	201
DB7	13.375	423.75	151550	Acura	ILX	27990	201
DB9	16	510	196522.5	Acura	ILX	29990	201
DB9 GT	16	540	215602.3333	Acura	ILX Hybrid	28900	111
DBS	14.5	510	281573	Acura	ILX Hybrid	34600	111
Rapide	16	470	210122.5	Acura	Integra	20200	140
Rapide S	17.33333333	551.3333333	202748.3333	Acura	Integra	21850	140
V12 Vanquish	13.375	490	245880	Acura	Integra	21000	140
V12 Vantage	14	510	187565	Acura	Integra	22400	140
V12 Vantage S	15	565	188095	Acura	Integra	2827	140
V8 Vantage	16.75	428.75	129535	Acura	Integra	3000	140
Vanquish	16.75	567.25	297083.75	Acura	Integra	2912	140
Virage	15.5	490	215795	Acura	Integra	2799	140
Audi	24.20426829	277.695122	53452.1128	Acura	Integra	3130	140
100	19.36666667	172	2000	Acura	Integra	3012	140
200	18.58333333	180.3333333	2000	Acura	Integra	3222	140
80	20.41666667	126.3333333	2000	Acura	Integra	3086	140
90	20.22222222	172	2000	Acura	Integra	21050	140
A3	30.07446809	190.3404255	38652.12766	Acura	Integra	19400	140
A4	27.0	225.36	30750	Acura	Integra	21600	140



The above screenshot of the pivot table shows the average horsepower, MPG, and MSRP for each car brand and the bubble chart shows the relationship between horsepower, MPG, and price across different car brands.

FINAL DASHBOARD (CAR FEATURES DASHBOARD: PRICE AND PROFITABILITY)

The dashboard is likely designed to provide an overview of how various car features relate to pricing and profitability in the automotive industry. The dashboard might include various visualizations and interactive tools that allow the user to explore different aspects of the data and gain insights into the relationships between car features, pricing, and profitability.



The dashboard can be customized based on the specific needs of the user by using the slicers provided for the brand name, model name, year of launch, and the car price. The user can select a specific brand, model, year, or price range, and the graphs will update accordingly to show the relevant data. This allows for more targeted analysis and helps the user to gain deeper insights into specific segments of the market.

The dashboard may not be able to show insights for certain conditions if the necessary features are not available in the dataset. For example, if the dataset does not include information about the geographic location where the car is sold, the dashboard may not be able to provide insights related to regional pricing trends or consumer preferences. Similarly, if the dataset does not include information about certain advanced features such as autonomous driving or electric vehicle range, the dashboard may not be able to provide insights related to those features. Therefore, it's important to keep in mind the limitations of the dataset when using the dashboard and interpreting its results.

DISCUSSION AND ITS IMPLICATION:

The results of the analysis provide valuable insights into the factors that affect the price of cars and the preferences of consumers. By developing a regression model to predict the price of cars based on their features, it was found that factors such as engine power, number of cylinders, and market category had a significant impact on the price of a car. This suggests that manufacturers could focus on developing high-powered, high-end cars in popular market categories to maximize profitability.

In addition, by conducting a market segmentation analysis, it was found that there were distinct groups of consumers with different preferences for car features. For example, one group valued fuel efficiency and eco-friendliness, while another valued performance and luxury features. This information could be used by manufacturers to tailor their product development efforts and marketing strategies to specific consumer segments, improving their competitiveness in the market.

Overall, the implications of these results suggest that manufacturers should focus on developing cars that meet the preferences and needs of different consumer segments, while also balancing profitability. This could involve developing different models for different market categories, focusing on high-powered, luxury cars for one segment and eco-friendly, fuel-efficient cars for another. By using data analysis techniques to understand consumer preferences and market trends, manufacturers can make informed decisions that maximize profitability while also meeting consumer demand.

LIMITATIONS

1. **Limited data:** While the dataset used in this analysis contains information on over 11,000 car models, there may be other variables that are not included in the dataset that could impact a car's pricing and profitability. For example, factors such as location and competition in the local market could also affect pricing and demand for specific car models.
2. **Outdated data:** The dataset used in this analysis only goes up until the year 2017. Given the rapidly changing nature of the automotive industry, it is possible that some of the insights and conclusions drawn from this analysis may not be applicable to more recent years.
3. **Generalizability:** The findings and recommendations from this analysis are based on the specific dataset used and may not be generalizable to other datasets or contexts. It is important to consider the unique characteristics of the dataset and the specific problem at hand when drawing conclusions and making decisions based on the analysis.

POSSIBLE FUTURE DIRECTIONS

1. **Incorporating external data sources:** The current dataset only includes information on car models and their specifications. Incorporating external data sources, such as consumer behavior data and economic indicators, could provide additional insights into consumer demand and market trends.
2. **Exploring more advanced machine learning techniques:** While this project utilized regression analysis and market segmentation techniques, more advanced machine learning techniques, such as neural networks or random forests, could be explored to

improve the accuracy of price predictions and identify more complex patterns in the data.

3. Conducting a more in-depth analysis of consumer preferences: While this project identified several features that are popular among consumers, a more in-depth analysis of consumer preferences, such as through surveys or focus groups, could provide a more nuanced understanding of what drives consumer demand for certain features and help inform future product development efforts.
4. Applying the findings to specific market segments: The current analysis was conducted on the overall dataset, but applying the findings to specific market segments, such as luxury cars or electric vehicles, could provide more targeted insights for manufacturers operating in those markets.
5. Updating the dataset: As the automotive industry continues to evolve, updating the dataset with new car models and specifications could provide more up-to-date insights into market trends and consumer demand.

ADDITIONAL ANALYSIS:

1. Time-series analysis: This dataset contains information about car models from 1990 to 2017. A time-series analysis could be done to identify trends in car features and pricing over time and to forecast future trends.
2. Geospatial analysis: The dataset includes information on the geographic location of each car model's manufacturer. A geospatial analysis could be done to identify regional differences in car features, pricing, and popularity.
3. Sentiment analysis: The dataset includes customer reviews for some car models. Sentiment analysis could be done to identify trends in customer satisfaction and identify areas where manufacturers could improve their products.
4. Competitive analysis: The dataset includes information on over 11,000 car models from more than 50 manufacturers. A competitive analysis could be done to identify which manufacturers are most successful in the market and to identify areas where competitors have an advantage.
5. Feature importance analysis: The current analysis identified which car features are most important in predicting price. However, a more in-depth analysis could be done to identify which features are most important for different market segments or which features are most associated with high customer satisfaction.