Car Fuel Economy Prediction

By: Jeffrey He, Pranav Swaminathan

Mentors: Satyajit Mojumder, Prof. Wing Kam Liu, Prof. Mark Fleming

What is Car Fuel Economy

- Amount of distance a car can travel in a certain amount of gas
- Units in miles per gallon
- Two tests are conducted: city driving and highway driving
- Factors affecting: weather, speeding, weight, maintenance
- Helps save money and reduces emissions



System and Design

- Make a Car recommendation website which asks the user for input in terms of what sort of car they are looking for such as seats, price, safety, and mpg and outputs the best cars that fit the criteria
- Produce a car fuel economy model that can reliably predict mpg given several input car parameters to help determine which cars are more safe and valuable for the money spent





Steps



Purpose

- Fuel costs ~\$3000 per year for an average US Citizen
- Consumers mainly consider pricing, seating, safety, and mpg
- Car fuel efficiency changes year by year along with driver skill
- Predict fuel efficiency for any car
- Compare cars on features such as mpg or price





Car Depreciation

- As time goes on, fuel efficiency stays the same as long as car's components are maintained well.
- As time goes on, car price decreases exponentially



Data Collection

- Large dataset from EPA containing over 40 brands of car parameters including horsepower, mpg, weight, model from 1984-2021. We are currently analyzing data from 2020, however, we have access to larger amounts of data.
- Additional features of seating, car price, and safety obtained from usnews.

2020 Mazda Mazda3





Feature Extraction

We conducted a sensitivity analysis on many features to identify which ones affect fuel economy the most.



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Feature Extraction

We used pearson correlation to identify any strong correlations between fuel economy and other identified features.

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Horsepower -	1	0.68	0.39	0.51	-0.27	-0.22	0.76	-0.74	-0.32	0.66	0.44	-0.68		1.00
Cylinders -	0.68	1	0.26	0.64	-0.16	-0.27	0.78	-0.73	-0.2	0.63	0.37	-0.7		- 0.75
# of Gears -	0.39	0.26	1	0.48	-0.61		0.36	-0.47		0.4	0.37	-0.35		
Weight -	0.51	0.64	0.48	1	-0.34	-0.52	0.6	-0.69	0.2	0.53	0.23	-0.64		- 0.50
Axle Ratio -	-0.27	-0.16	-0.61	-0.34	1	0.15	-0.3	0.4	0.081	-0.28	-0.39	0.23		- 0.25
N/V Ratio -	-0.22	-0.27		-0.52	0.15	1		0.2	-0.16	-0.085		0.1		
CO2 (g/mi) -	0.76	0.78	0.36	0.6	-0.3	-0.15	1	-0.96	-0.22	0.56	0.31	-0.9		- 0.00
city_FE -	-0.74	-0.73	-0.47	-0.69	0.4	0.2	-0.96	1	0.18	-0.58	-0.35	0.92		0.25
Seating -	-0.32	-0.2	-0.067	0.2	0.081	-0.16	-0.22	0.18	1	-0.42	-0.46	0.15		
MSRP Price -	0.66	0.63	0.4	0.53	-0.28	-0.085	0.56	-0.58	-0.42	1	0.56	-0.58		0.50
Safety Rating -	0.44	0.37	0.37	0.23	-0.39		0.31	-0.35	-0.46	0.56	1	-0.27		0.75
hwy_FE -	-0.68	-0.7	-0.35	-0.64	0.23	0.1	-0.9	0.92	0.15	-0.58	-0.27	1		
	Horsepower -	Cylinders -	# of Gears -	Weight -	Axle Ratio -	N/V Ratio -	CO2 (g/mi) -	city_FE -	Seating -	MSRP Price -	afety Rating -	hwy_FE -		

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Feature Extraction

After performing sensitivity analysis, we ended up with several features that consumers care most and several features that affect the car fuel economy or mpg.

features consumers care about	features affecting car fuel economy
# of seats	# of Cylinders
price	Horsepower
safety	Drive system
mpg	Weight

Neural Networks

Using a feed forward neural network, one where information only goes forward, with currently 4 inputs and 1 output. This is used to predict the car fuel economy or mpg given a cars attributes.



Neural Networks



Mean absolute error: 0.07 Mean squared error: 0.01 R-Squared: 0.76

5-fold Cross Validation:

	Group 1	Group 2	Group 3	Group 4	Group 5
Mean Absolute Error	0.08	0.06	0.09	0.08	0.07
R-Squared	0.66	0.80	0.71	0.63	0.78

Streamlit Web App

 Streamlit: an open-source python framework for building web apps for Machine Learning and Data Science

Car Criteria Filter Sort by Fuel efficiency (mpg) or price highway fuel efficiency Select minimum number of seats 8 2 Select maximum number of seats 8 Please write the minimum safety rating from 0 to 10 9.00 Select minimum price 42435 150000 1 Select maximum price 106579 150000 1 Select minimum mpg 1 50

Input: Specify user parameters

Output: Top 5 car recommendations fitting user parameters

Car feature filter and recommender

Top 5 cars according to highway fuel efficiency

1. Mercedes-benz cla 250 Seating: 5 MSRP: \$50406 Safety: N/A car city mpg: 31.7

car highway mpg: 51.5

2. Audi a4 Seating: 5 MSRP: \$43650 Safety: 9.5/10 car city mpg: 35.1 car highway mpg: 50.3

3. Audi a3 Seating: 5 MSRP: \$44750 Safety: 9.3/10 car city mpg: 32.9 car highway mpg: 50.3







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