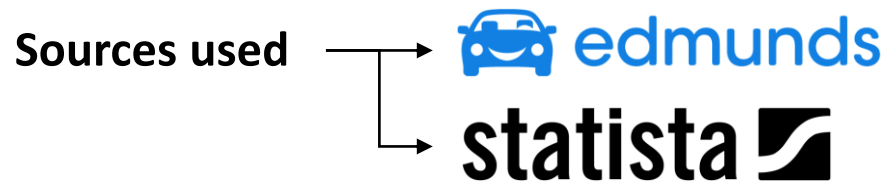


- Collecting Additional Attributes for Individual Cars:

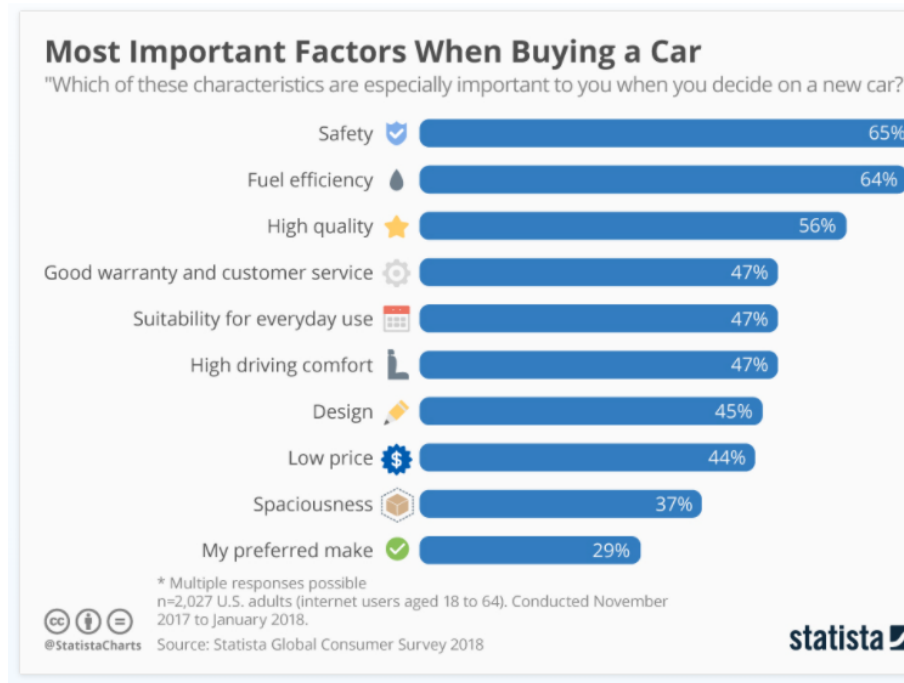


- Method Used for data collection:

- 1) Python Web Scraping
- 2) Excel

- Important Parameters Collected:

- 1) Price
- 2) Seating Capacity
- 3) MPG
- 4) Warranty Year
- 5) Warranty Mileage
- 6) Cargo Capacity including seats
- 7) Fuel Capacity
- 8) Car Rating



Web Scrapping Vehicle Features & Review Data



Kafle, Lee, Siddique

- Generating links for all the **765** vehicles using Python:

- 1) Identifying unique vehicles - **623**
- 2) Generating two separate sets of links
 - a. Features
 - b. Review

1	Feature	Review
2	https://www.edmunds.com/Subaru/Other/2017/feature-specs/	https://www.edmunds.com/Subaru/Other/2017/review/
3	https://www.edmunds.com/Honda/Fit/2008/feature-specs/	https://www.edmunds.com/Honda/Fit/2008/review/
4	https://www.edmunds.com/Toyota/Camry/2012/feature-specs/	https://www.edmunds.com/Toyota/Camry/2012/review/
5	https://www.edmunds.com/Honda/Odyssey/2010/feature-specs/	https://www.edmunds.com/Honda/Odyssey/2010/review/
6	https://www.edmunds.com/Toyota/Celica/1997/feature-specs/	https://www.edmunds.com/Toyota/Celica/1997/review/
7	https://www.edmunds.com/Chrysler/Town-and-Country/2008/feature-specs/	https://www.edmunds.com/Chrysler/Town-and-Country/2008/review/
8	https://www.edmunds.com/Chrysler/PT/2008/feature-specs/	https://www.edmunds.com/Chrysler/PT/2008/review/
9	https://www.edmunds.com/GMC/Yukon/2004/feature-specs/	https://www.edmunds.com/GMC/Yukon/2004/review/
10	https://www.edmunds.com/BMW/5-series/2013/feature-specs/	https://www.edmunds.com/BMW/5-series/2013/review/
11	https://www.edmunds.com/Toyota/Highlander/2008/feature-specs/	https://www.edmunds.com/Toyota/Highlander/2008/review/
12	https://www.edmunds.com/Toyota/RAV4/2016/feature-specs/	https://www.edmunds.com/Toyota/RAV4/2016/review/
13	https://www.edmunds.com/Ford/E-450/1999/feature-specs/	https://www.edmunds.com/Ford/E-450/1999/review/
14	https://www.edmunds.com/Lexus/LS-430/2006/feature-specs/	https://www.edmunds.com/Lexus/LS-430/2006/review/
15	https://www.edmunds.com/Honda/Fit/2015/feature-specs/	https://www.edmunds.com/Honda/Fit/2015/review/
16	https://www.edmunds.com/Dodge/Other/2012/feature-specs/	https://www.edmunds.com/Dodge/Other/2012/review/
17	https://www.edmunds.com/Lexus/RX-350/2008/feature-specs/	https://www.edmunds.com/Lexus/RX-350/2008/review/
18	https://www.edmunds.com/Volkswagen/Passat/2017/feature-specs/	https://www.edmunds.com/Volkswagen/Passat/2017/review/
19	https://www.edmunds.com/Chevrolet/Equinox/2015/feature-specs/	https://www.edmunds.com/Chevrolet/Equinox/2015/review/
20	https://www.edmunds.com/Honda/Fit/2007/feature-specs/	https://www.edmunds.com/Honda/Fit/2007/review/
21	https://www.edmunds.com/Volvo/XC60/2013/feature-specs/	https://www.edmunds.com/Volvo/XC60/2013/review/
22	https://www.edmunds.com/Ford/E450-Super-Duty/2001/feature-specs/	https://www.edmunds.com/Ford/E450-Super-Duty/2001/review/

Features
[1-7]

Review
[8]

- Important Parameters Collected:

Attributes from Manufacturer

- 1) Price
- 2) Seating Capacity
- 3) MPG
- 4) Warranty Year
- 5) Warranty Mileage
- 6) Cargo Capacity including seats
- 7) Fuel Capacity

Pristine Real-Time Attributes

- 8) Car Rating



Web Scrapping Vehicle Features & Review Data



Kafle, Lee, Siddique

• Packages Used in Python Web Scrapping Method:

- BeautifulSoup - parsing HTML & Script files for websites
- Selenium - pulling the web data
- Chrome driver - launching & automated testing of the pulled website
- Pandas - creating lists & dataframe

• Methodology Used:

- Identifying HTML elements for each required data
- Collecting the required numeric & text data
- Cleaning the data
- Storing the data in a dataframe
- Bypassing the unfounded websites

```
# import libraries
from bs4 import BeautifulSoup
import numpy as np
from time import sleep
from random import randint
from selenium import webdriver
import pandas as pd

# creating empty data list
price_dt = []
mpg_dt = []
seat_dt = []
```

```
23 df = pd.read_csv("linklist_11.csv")
24 mylist = df['link1'].tolist()
25
26 # Creating substring
27
28 for i in range(16):
29     url = mylist[i]
30     driver2 = webdriver.Chrome()
31     driver2.get(url)
32     sleep(randint(10, 20))
33     soup = BeautifulSoup(driver2.page_source, 'html.parser')
34
35     # First checking whether the link is valid
36     fnd = '0'
37
38     found = soup.find(class_="p-1 p-md-3 text-center display-1")
39     if found is None:
40         dummy = 1
41     else:
42         fnd = found.text
43
44     nt = 'page not found'
45     if nt in fnd:
46         final = 0
47         mpg = 0
48         seat = 0
49         price_dt.append(final)
50         mpg_dt.append(mpg)
51         seat_dt.append(seat)
52         fnd = '0'
53
54     else: # price scraping
55         try:
56             price = soup.find(class_='heading-3').text
57             final_price = price.replace("$", "")
58             final_price = final_price.replace(",", "")
59         except:
60             final_price = 0
61
62         if final_price.isnumeric():
63             final = int(final_price)
64         else:
65             final = 0
66         price_dt.append(final)
67
68     # mpg scraping
69     mpg_raw = soup.find_all(class_='px-1 px-lg-0_75 px-xl-1 py-0_5')
70     mpg_dt.append(mpg_raw)
71
72     # seat cap scraping
73     seat_raw = soup.find_all(class_='px-1 px-lg-0_75 px-xl-1 py-0_5')
74     seat_dt.append(seat_raw)
75
76 df = pd.DataFrame()
77 # forming the dataframe
78
79 df['price'] = price_dt
80 df['mpg'] = mpg_dt
81 df['seat'] = seat_dt
82
83 print(df)
```

```
23 df = pd.read_csv("linklist_11.csv")
24 mylist = df['link1'].tolist()
25
26 # Creating substring
27
28 for i in range(16):
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70     mpg_dt.append(mpg_raw)
71
72     # seat cap scraping
73     seat_raw = soup.find_all(class_='px-1 px-lg-0_75 px-xl-1 py-0_5')
74     seat_dt.append(seat_raw)
75
76 df = pd.DataFrame()
77 # forming the dataframe
78
79 df['price'] = price_dt
80 df['mpg'] = mpg_dt
81 df['seat'] = seat_dt
82
83 print(df)
```



Web Scrapping Vehicle Features & Review Data



Kafle, Lee, Siddique

- Parameters Collected:
 - From the Feature Set:
 - Price
 - Seating Capacity
 - MPG
 - Warranty Year
 - Warranty Mileage
 - Cargo Capacity including seats
 - Fuel Capacity
 - From the Review Set:
 - Car Rating

```
Python 3.8.8 (default, Apr 13 2021, 15:08:03)
[MSC v.1916 64 bit (AMD64)]
Type "copyright", "credits" or "license()" for more
information.

IPython 7.22.0 -- An enhanced Interactive Python.

In [1]: runfile('C:/Users/Heejun Lee/Dropbox/
000SharedEconometrics/Assignment3/Jawwaad code/
Code_2.py', wdir='C:/Users/Heejun Lee/Dropbox/
000SharedEconometrics/Assignment3/Jawwaad code')

price mpg seat
0 0 0 0
1 16070 29 5
2 23220 28 5
3 33405 20 8
4 0 22 yes
5 28800 18 7
6 0 0 0
7 35460 15 6
8 47800 28 5
9 32900 20 7
10 27670 25 5
```

```
In [72]: runcell(0, 'C:/Users/Heejun Lee/Dropbox/
000SharedEconometrics/Assignment3/Jawwaad code/Code_2.py')
0
2008 Honda Fit Review 4.7 out of 5 stars
0
2012 Toyota Camry Review 4.2 out of 5 stars
0
2010 Honda Odyssey Review 4.3 out of 5 stars
0
1997 Toyota Celica Review 4.9 out of 5 stars
0
2008 Chrysler Town and Country Review 3.7 out of 5 stars
0
2004 GMC Yukon Review 4.8 out of 5 stars
0
2013 BMW 5 Series Review 4.1 out of 5 stars
0
2008 Toyota Highlander Review 4.6 out of 5 stars
0
2016 Toyota RAV4 Review 4.1 out of 5 stars
0
2006 Lexus LS 430 Review 4.8 out of 5 stars
0
2015 Honda Fit Review 4.0 out of 5 stars
0
2008 Lexus RX 350 Review 4.4 out of 5 stars
0
```



Web Scrapping Vehicle Features & Review Data

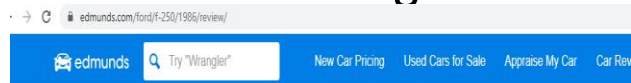


Kafle, Lee, Siddique

- **Issues faced in web scraping:**

- Dealing with unfounded web pages of unavailable car models
- Dealing with specific car models like 'Other'
- Time required for data pulling
- Issues calculating safety & comfort points
- Combining manual collect

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Safety

2 Front Headrests	✓
3 Rear Headrests	✓
Auto Delay Off Headlamps	✓
Blind Spot Warning Accident Avoidance System	✓
Child Seat Anchors	✓
Daytime Running Lights	✓
Dual Front Side-Mounted Airbags	✓
Dusk Sensing Headlamps	✓
Engine Immobilizer	✓
Front And Rear Head Airbags	✓



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Comfort & Convenience

Cruise Control	✓
Electric Power Steering	✓
Front And Rear Cupholders	✓
Front And Rear Door Pockets	✓
Front Seatback Storage	✓
Overhead Console With Storage	✓
Rear View Camera	✓
Tilt And Telescopic Steering Wheel	✓
Transmission, Cruise And Audio Controls On Steering Wheel	✓
Interior Air Filtration	✓