# Exploratory Data Analysis

#### EDA 란

- 수집한 데이터가 들어왔을 때, 이를 다양한 각도에서 관찰하고 이해 하는 과정
- 데이터를 분석하기 전에 그래프나 통계적인 방법으로 자료를 직관 적으로 바라보는 과정

#### EDA 필요 이유

- 데이터의 분포 및 값을 검토함으로써 데이터가 표현하는 현상을 더 잘 이해
- 데이터에 대한 잠재적인 문제를 발견
- 다양한 각도에서 살펴보는 과정을 통해 문제 정의 단계에서 미쳐 발생하지 못했을 다양한 패턴을 발견

#### EDA 과정

- 분석의 목적과 변수가 무엇이 있는지 확인, 개별 변수의 이름이나 설명을 가지는지 확인
- 데이터를 전체적으로 살펴보기
  - 데이터에 문제가 없는지 확인, head나 tail 부분을 확인
  - 추가적으로 다양한 탐색(이상치, 결측치 등을 확인하는 과정)
- 데이터의 개별 속성값을 관찰
  - 각 속성값이 예측한 범위와 분포를 갖는지 확인
  - 만약 그렇지 않다면, 이유가 무엇인지를 확인해 본다.
- 속성 간의 관계에 초점을 맞추어, 개별 속성 관찰에서 찾아내지 못했던 패턴을 발견(상관관계, 시각화 등)

• EDA를 위한 필요한 라이브러리를 import 함

import pandas as pd

import numpy as np

import seaborn as sns # 가시화

import matplotlib.pyplot as plt # 가시화

%matplotlib inline

sns.set(color\_codes=True)

• 데이터를 data frame으로 로딩

```
# 10, 000 rows and more than 10 columns
```

```
df = pd.read_csv("data.csv")
```

# To display the top 5 rows

df.head(5)

# To display the bottom 5 rows

df.tail(5)

	Make	Model	Year	Engine Fuel Type	Engine HP	Engine Cylinders	Transmission Type	Driven_Wheels	Number of Doors	Market Category	Vehicle Size	Vehicle Style	highway MPG	city mpg	Popula
0	BMW	1 Series M	2011	premium unleaded (required)	335.0	6.0	MANUAL	rear wheel drive	2.0	Factory Tuner,Luxury,High- Performance	Compact	Coupe	26	19	3
1	BMW	1 Series	2011	premium unleaded (required)	300.0	6.0	MANUAL	rear wheel drive	2.0	Luxury,Performance	Compact	Convertible	28	19	3
2	BMW	1 Series	2011	premium unleaded (required)	300.0	6.0	MANUAL	rear wheel drive	2.0	Luxury,High- Performance	Compact	Coupe	28	20	3
3	BMW	1 Series	2011	premium unleaded (required)	230.0	6.0	MANUAL	rear wheel drive	2.0	Luxury,Performance	Compact	Coupe	28	18	3

	Make	Model	Year	Engine Fuel Type	Engine HP	Engine Cylinders	Transmission Type	Driven_Wheels	Number of Doors	Market Category	Vehicle Size	Vehicle Style	highwa; MP(
11909	Acura	ZDX	2012	premium unleaded (required)	300.0	6.0	AUTOMATIC	all wheel drive	4.0	Crossover,Hatchback,Luxury	Midsize	4dr Hatchback	2;
11910	Acura	ZDX	2012	premium unleaded (required)	300.0	6.0	AUTOMATIC	all wheel drive	4.0	Crossover, Hatchback, Luxury	Midsize	4dr Hatchback	2;
11911	Acura	ZDX	2012	premium unleaded (required)	300.0	6.0	AUTOMATIC	all wheel drive	4.0	Crossover, Hatchback, Luxury	Midsize	4dr Hatchback	2;
11912	Acura	ZDX	2013	premium unleaded (recommended)	300.0	6.0	AUTOMATIC	all wheel drive	4.0	Crossover, Hatchback, Luxury	Midsize	4dr Hatchback	2;
11913	Lincoln	Zephyr	2006	regular unleaded	221.0	6.0	AUTOMATIC	front wheel drive	4.0	Luxury	Midsize	Sedan	21

#### • 자료형 조사

```
In [4]: # Checking the data type
        df.dtypes
Out [4]: Make
                               object
                               object
        Model
                                int64
        Year
        Engine Fuel Type
                               object
        Engine HP
                              float64
                              float64
        Engine Cylinders
        Transmission Type
                               object
        Driven Wheels
                               object
                              float64
        Number of Doors
        Market Category
                               object
        Vehicle Size
                               object
        Vehicle Style
                               object
                                int64
        highway MPG
                                int64
        city mpg
                                int64
        Popularity
        MSRP
                                int64
        dtype: object
```

• 관련없는(irrelevant columns) 컬럼을 제외함

```
In [6]: # Dropping irrelevant columns

df = df.drop(['Engine Fuel Type', 'Market Category', 'Vehicle Style', 'Popularity', 'Number of Doors', 'Vehicle Size df.head(5)

Out[6]:

Make Model Year Engine HP Engine Cylinders Transmission Type Driven_Wheels highway MPG city mpg MSRP
```

	Make	Model	Year	Engine HP	Engine Cylinders	Transmission Type	Driven_Wheels	highway MPG	city mpg	MSRP
0	BMW	1 Series M	2011	335.0	6.0	MANUAL	rear wheel drive	26	19	46135
1	BMW	1 Series	2011	300.0	6.0	MANUAL	rear wheel drive	28	19	40650
2	BMW	1 Series	2011	300.0	6.0	MANUAL	rear wheel drive	28	20	36350
3	BMW	1 Series	2011	230.0	6.0	MANUAL	rear wheel drive	28	18	29450
4	BMW	1 Series	2011	230.0	6.0	MANUAL	rear wheel drive	28	18	34500

• 컬럼 이름을 변경

1 BMW

2 BMW

3 BMW

BMW

1 Series 2011 300.0

1 Series 2011 300.0

1 Series 2011 230.0

230.0

1 Series 2011

6.0

6.0

6.0

6.0

28

19 40650

20 36350

18 29450

18 34500

MANUAL rear wheel drive

MANUAL rear wheel drive

MANUAL rear wheel drive

MANUAL rear wheel drive

• 중복 행을 제외함

```
In [8]: # Total number of rows and columns
    df.shape

Out[8]: (11914, 10)

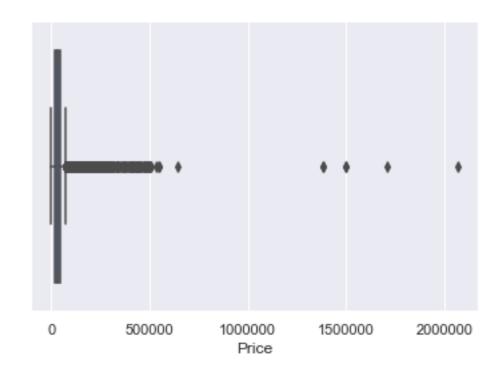
In [10]: # Rows containing duplicate data
    duplicate_rows_df = df[df.duplicated()]
    print("number of duplicate rows: ", duplicate_rows_df.shape)
    number of duplicate rows: (989, 10)
```

missing or null 값을 제외함

```
In [15]: # After dropping the values
In [13]: print(df.isnull().sum())
                                      In [14]: # Dropping the missing values.
                                                                                           print(df.isnull().sum())
                                                df = df.dropna()
                                                df.count()
         Make
                                                                                           Make
                                                                                                           0
         Model
                                                                                           Model
                                      Out[14]: Make
                                                                10827
         Year
                                                                                           Year
                                                Model
                                                                10827
                                                                                           HP
                          69
         HP
                                                                10827
                          30
                                                Year
         Cylinders
                                                                                           Cylinders
                                               HP
                                                                10827
         Transmission
                                                                                           Transmission
                                               Cylinders
                                                                10827
         Drive Mode
                                                                                           Drive Mode
                                               Transmission
                                                                10827
         MPG-H
                                                                                           MPG-H
                                                Drive Mode
                                                                10827
         MPG-C
                                                                                           MPG-C
                                                MPG-H
                                                                10827
         Price
                                                                                           Price
                                                                10827
         dtype: int64
                                                MPG-C
                                                                                           dtype: int64
                                                Price
                                                                10827
                                                dtype: int64
```

Outlier 검출

```
In [17]: sns.boxplot(x=df['Price'])
Out[17]: <matplotlib.axes._subplots.AxesSubplot at 0x1187383c8>
```

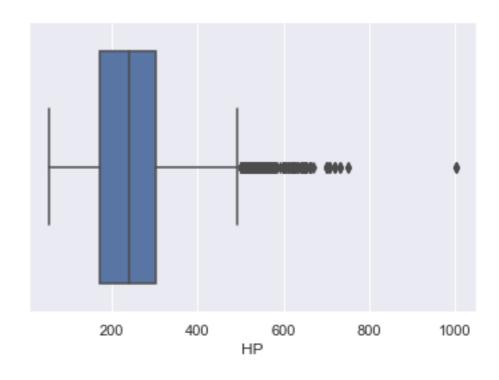


#### 이상값탐지

- 개별 데이터 관찰
- 통계값 활용
- 시각화 활용
- 기계학습 활용

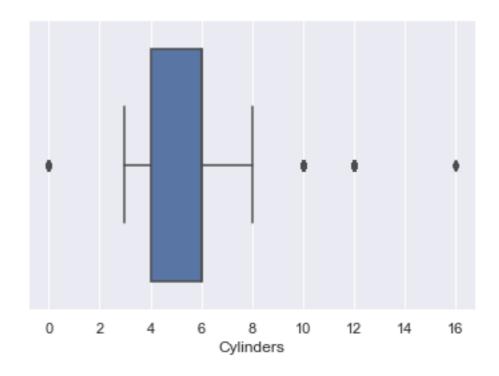
Outlier 검출

```
In [18]: sns.boxplot(x=df['HP'])
Out[18]: <matplotlib.axes._subplots.AxesSubplot at 0x118b20550>
```



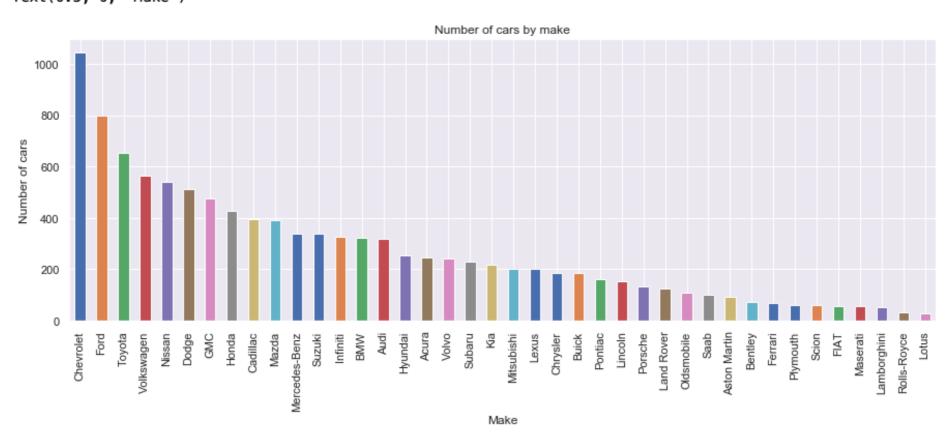
Outlier 검출

```
In [19]: sns.boxplot(x=df['Cylinders'])
Out[19]: <matplotlib.axes._subplots.AxesSubplot at 0x118c78f60>
```

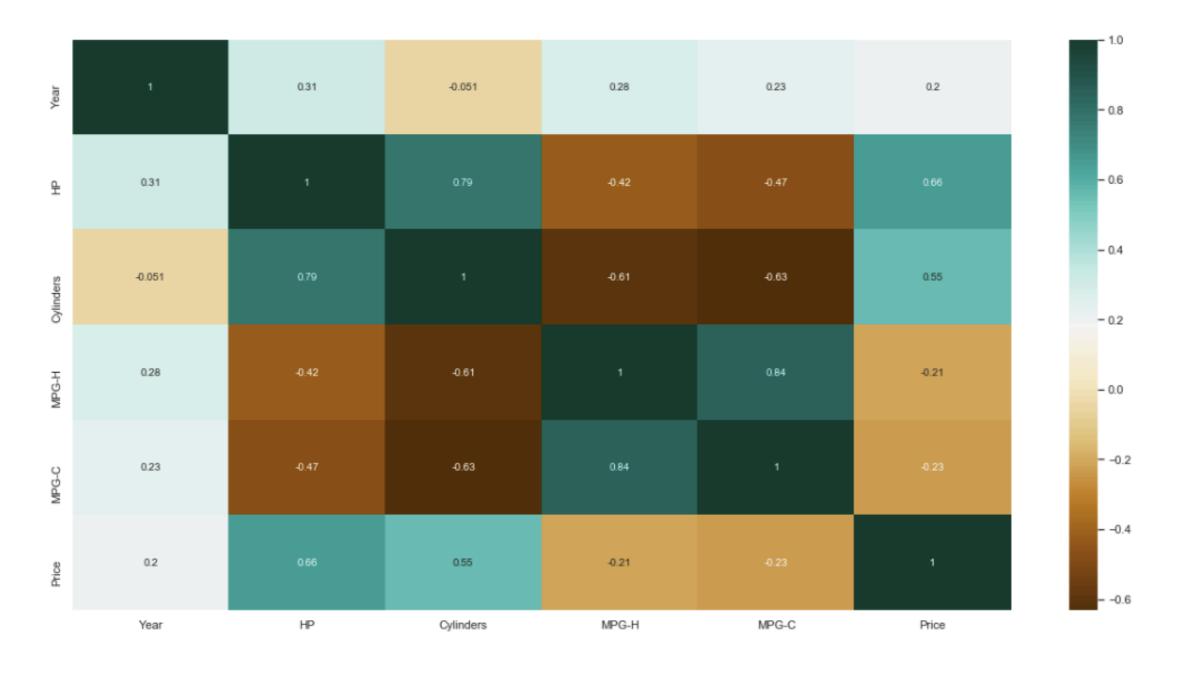


#### • 다양한 특징 플롯

```
In [35]: df.Make.value_counts().nlargest(40).plot(kind='bar', figsize=(15,5))
    plt.title("Number of cars by make")
    plt.ylabel("Number of cars")
    plt.xlabel("Make")
Out[35]: Text(0.5, 0, 'Make')
```



#### Heat Map



• 두 변수 간의 상호관계(correlation between two variables)

```
In [34]: # Plotting a scatter plot
          fig, ax = plt.subplots(figsize=(10,6))
          ax.scatter(df['HP'], df['Price'])
          ax.set_xlabel('HP')
          ax.set_ylabel('Price')
          plt.show()
             2000000
             1500000
           E 1000000
              500000
                  0
                                200
                                                                          800
                                                                                        1000
                                                            600
```

HΡ