Data Wrangling - Cleansing

September 19, 2022

```
import numpy as np
 import pandas as pd
auto_price = pd.read_csv('https://raw.githubusercontent.com/ammishra08/

→MachineLearning/master/Datasets/Automobile_price_data__Raw_.csv', sep = ',')
display(auto_price)
     symboling normalized-losses
                                              make fuel-type aspiration
0
              3
                                   ?
                                      alfa-romero
                                                                       std
                                                          gas
              3
1
                                      alfa-romero
                                                          gas
                                                                       std
2
              1
                                   ?
                                      alfa-romero
                                                          gas
                                                                       std
              2
3
                                164
                                              audi
                                                          gas
                                                                       std
              2
4
                                164
                                              audi
                                                                       std
                                                          gas
             . . .
                                 . . .
                                               . . .
                                                          . . .
200
                                 95
             -1
                                             volvo
                                                                       std
                                                          gas
201
             -1
                                 95
                                             volvo
                                                                    turbo
                                                          gas
             -1
                                 95
202
                                                                       std
                                             volvo
                                                          gas
203
                                 95
             -1
                                             volvo
                                                       diesel
                                                                    turbo
                                 95
204
             -1
                                             volvo
                                                                    turbo
                                                          gas
    num-of-doors
                     body-style drive-wheels engine-location
                                                                   wheel-base
                                                           front
                                                                          88.6
0
                    convertible
              two
                                           rwd
1
              two
                    convertible
                                           rwd
                                                           front
                                                                          88.6
                                                                                 . . .
2
                      hatchback
                                                           front
                                                                          94.5
              two
                                           rwd
                                                                          99.8
3
             four
                           sedan
                                            fwd
                                                           front
4
             four
                           sedan
                                            4wd
                                                           front
                                                                          99.4
. .
200
             four
                           sedan
                                            rwd
                                                           front
                                                                         109.1
201
             four
                           sedan
                                            rwd
                                                           front
                                                                         109.1
202
             four
                                                                         109.1
                           sedan
                                           rwd
                                                           front
203
                           sedan
                                                                         109.1
             four
                                            rwd
                                                           front
204
                                                                         109.1
             four
                           sedan
                                            rwd
                                                           front
     engine-size
                    fuel-system
                                   bore
                                         stroke compression-ratio horsepower
                                                                 9.0
0
              130
                                  3.47
                                            2.68
                            mpfi
                                                                             111
1
              130
                            mpfi
                                  3.47
                                            2.68
                                                                 9.0
                                                                              111
2
              152
                            mpfi
                                  2.68
                                            3.47
                                                                 9.0
                                                                             154
3
                                  3.19
                                            3.40
                                                                10.0
                                                                             102
              109
                            mpfi
```

4	136	mpf	i 3.19	3.40	8.0	115
200	141	mpf	i 3.78	3.15	9.5	114
201	141	mpf	i 3.78	3.15	8.7	160
202	173	mpf	i 3.58	2.87	8.8	134
203	145	id		3.40	23.0	106
204	141	mpf	i 3.78	3.15	9.5	114
		•				
	peak-rpm cit	y-mpg highw	ay-mpg	price		
0	5000	21	27	13495		
1	5000	21	27	16500		
2	5000	19	26	16500		
		10	20	10000		
3				16500 13950		
3 4	5500	24	30	13950		
3 4 						

25 19045

23 21485

27 22470

25 22625

[205 rows x 26 columns]

5300

5500

4800

5400

19

18

26

19

201

202

203

204

[3]: auto_price.isnull().sum()

[3]: symboling 0 normalized-losses 0 make0 fuel-type 0 aspiration 0 num-of-doors 0 body-style 0 drive-wheels 0 engine-location 0 wheel-base 0 length 0 width 0 height 0 curb-weight 0 engine-type 0 num-of-cylinders 0 engine-size 0 fuel-system 0 0 bore stroke 0 compression-ratio 0 horsepower 0

```
0
     peak-rpm
                           0
     city-mpg
     highway-mpg
                           0
                           0
     price
     dtype: int64
[4]: # Replace '?' by np.nan
     auto_price.replace('?', np.nan, inplace = True)
[5]: auto_price.isnull().sum()
[5]: symboling
                            0
    normalized-losses
                           41
    make
                            0
     fuel-type
                            0
                            0
     aspiration
     num-of-doors
                            2
     body-style
                            0
     drive-wheels
     engine-location
                            0
     wheel-base
                            0
                            0
     length
     width
                            0
    height
                            0
     curb-weight
                            0
     engine-type
                            0
     num-of-cylinders
                            0
     engine-size
                            0
     fuel-system
                            0
     bore
                            4
     stroke
                            4
                            0
     compression-ratio
                            2
     horsepower
                            2
     peak-rpm
                            0
     city-mpg
     highway-mpg
                            0
                            4
     price
     dtype: int64
[6]: auto_price.select_dtypes(include = ['int64'])
[6]:
          symboling curb-weight
                                   engine-size
                                                city-mpg highway-mpg
     0
                  3
                             2548
                                            130
                                                        21
                                                                     27
                  3
                             2548
                                            130
                                                        21
                                                                     27
     1
     2
                  1
                             2823
                                            152
                                                        19
                                                                     26
     3
                  2
                             2337
                                            109
                                                        24
                                                                     30
     4
                  2
                             2824
                                            136
                                                        18
                                                                     22
```

• •	•••	•••	•••	•••	
200	-1	2952	141	23	28
201	-1	3049	141	19	25
202	-1	3012	173	18	23
203	-1	3217	145	26	27
204	-1	3062	141	19	25

[205 rows x 5 columns]

```
[7]: # convert object columns to numerical columns
cols = ['bore','stroke','horsepower','peak-rpm','price']
auto_price[cols] = auto_price[cols].apply(pd.to_numeric)
```

[8]: auto_price.dtypes

```
[8]: symboling
                             int64
     normalized-losses
                            object
    make
                            object
     fuel-type
                            object
     aspiration
                            object
     num-of-doors
                            object
     body-style
                            object
     drive-wheels
                            object
     engine-location
                            object
     wheel-base
                           float64
     length
                           float64
     width
                           float64
    height
                           float64
     curb-weight
                             int64
     engine-type
                            object
     num-of-cylinders
                            object
     engine-size
                             int64
     fuel-system
                            object
     bore
                           float64
     stroke
                           float64
     compression-ratio
                           float64
                           float64
     horsepower
     peak-rpm
                           float64
                             int64
     city-mpg
     highway-mpg
                             int64
     price
                           float64
     dtype: object
```

0.0.1 Central Tendencies

```
[9]: auto_price['body-style'].value_counts()
 [9]: sedan
                     96
     hatchback
                     70
      wagon
                     25
     hardtop
                      8
      convertible
                      6
      Name: body-style, dtype: int64
[10]: auto_price['body-style'].mode()
[10]: 0
           sedan
      dtype: object
[11]: # Median Value
      auto_price['price'].median()
[11]: 10295.0
[12]: # Mean Value
      auto price['price'].mean()
[12]: 13207.129353233831
     0.0.2 Handling Missing Values
[13]: auto_price['normalized-losses'].unique()
[13]: array([nan, '164', '158', '192', '188', '121', '98', '81', '118', '148',
             '110', '145', '137', '101', '78', '106', '85', '107', '104', '113',
             '150', '129', '115', '93', '142', '161', '153', '125', '128',
             '122', '103', '168', '108', '194', '231', '119', '154', '74',
             '186', '83', '102', '89', '87', '77', '91', '134', '65', '197',
             '90', '94', '256', '95'], dtype=object)
[14]: # Typecast column from object data types to float
      auto_price['normalized-losses'] = auto_price['normalized-losses'].
       →astype('float64')
[15]: auto_price['normalized-losses'].replace(np.nan, auto_price['normalized-losses'].
       →mean(), inplace = True)
[16]: auto_price.isnull().sum()
```

```
[16]: symboling
                             0
      normalized-losses
                             0
      make
                             0
      fuel-type
                             0
                             0
      aspiration
                             2
      num-of-doors
      body-style
                             0
      drive-wheels
                             0
      engine-location
                             0
      wheel-base
                             0
      length
                             0
      width
                             0
                             0
      height
                             0
      curb-weight
      engine-type
                             0
      num-of-cylinders
                             0
      engine-size
                             0
      fuel-system
                             0
      bore
                             4
      stroke
                             4
      compression-ratio
                             0
      horsepower
                             2
                             2
      peak-rpm
      city-mpg
                             0
      highway-mpg
                             0
      price
                             4
      dtype: int64
```

```
[17]: auto_price.dropna(inplace = True)
```

```
[18]: auto_price.shape
```

[18]: (193, 26)

0.0.3 Basic Imputation Techniques

- imputation by using statistics of each column with missing values
- imputation with constant vlue

```
[19]:
         Pregnancies
                       Glucose BloodPressure SkinThickness
                                                                  Insulin
                                                                             BMI
                    6
                          148.0
                                           72.0
                                                           35.0
                                                                      NaN
                                                                           33.6
                           85.0
                                           66.0
                                                           29.0
      1
                    1
                                                                      {\tt NaN}
                                                                           26.6
```

```
3
                   1
                         89.0
                                         66.0
                                                         23.0
                                                                  94.0
                                                                        28.1
      4
                                          4.0
                                                         35.0
                   0
                        137.0
                                                                 168.0 43.1
         DiabetesPedigreeFunction Age
                                         Outcome
      0
                             0.627
                                      5
                                               1
                             0.351
      1
                                     31
                                               0
      2
                             0.672
                                     32
                                               1
      3
                                               0
                             0.167
                                     21
      4
                             2.288
                                     33
                                               1
[20]: diabetes.shape
[20]: (768, 9)
      diabetes.isnull().sum().sort_values(ascending = False)
[21]: Insulin
                                   374
      SkinThickness
                                   227
      BloodPressure
                                    35
      BMI
                                    11
      Glucose
                                     5
      Outcome
                                     0
      Age
                                     0
      DiabetesPedigreeFunction
                                     0
      Pregnancies
                                     0
      dtype: int64
[22]: diabetes['Insulin'].replace(np.nan, diabetes['Insulin'].mean(), inplace = True)
[23]: diabetes.isnull().sum().sort_values(ascending = False)
[23]: SkinThickness
                                   227
      BloodPressure
                                    35
      BMI
                                    11
      Glucose
                                     5
      Outcome
                                     0
                                     0
      Age
      DiabetesPedigreeFunction
                                     0
      Insulin
                                     0
      Pregnancies
                                     0
      dtype: int64
[24]: from sklearn.impute import SimpleImputer
      # strategy = 'mean', 'median', 'most_frequent'
      impute = SimpleImputer(strategy='median')
      # fit = train, transform = apply transformation
```

64.0

NaN

 ${\tt NaN}$

23.3

2

8

183.0

[25]: diabetes_df = pd.DataFrame(data_array, columns = diabetes.columns) diabetes df [25]: Glucose BloodPressure SkinThickness Insulin BMI \ Pregnancies 0 6.0 148.0 72.0 35.0 105.659898 33.6 1 1.0 85.0 66.0 29.0 105.659898 26.6 2 8.0 64.0 183.0 27.0 105.659898 23.3 3 1.0 89.0 66.0 23.0 94.000000 28.1 0.0 4 137.0 4.0 35.0 168.000000 43.1 ••• 763 10.0 11.0 76.0 48.0 18.000000 32.9 7.0 27.0 105.659898 764 2.0 122.0 36.8 765 5.0 121.0 72.0 23.0 112.000000 26.2 766 1.0 6.0 126.0 27.0 105.659898 3.1 767 1.0 93.0 7.0 31.0 105.659898 3.4 DiabetesPedigreeFunction Outcome Age 0 0.627 5.0 1.0 1 0.351 31.0 0.0 2 0.672 32.0 1.0 3 0.167 21.0 0.0 4 2.288 33.0 1.0 . . ••• 0.0 763 0.171 63.0 764 0.340 27.0 0.0 765 0.245 3.0 0.0 0.349 47.0 766 1.0 767 0.315 23.0 0.0 [768 rows x 9 columns] [26]: diabetes_df.isnull().sum() [26]: Pregnancies 0 Glucose 0 BloodPressure 0 SkinThickness 0 0 Insulin 0 BMI 0 DiabetesPedigreeFunction 0 Age 0 Outcome dtype: int64

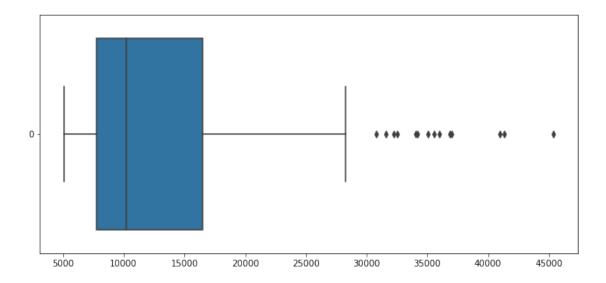
data_array = impute.fit_transform(diabetes)

```
[27]: import matplotlib.pyplot as plt import seaborn as sns
```

Matplotlib is building the font cache; this may take a moment.

```
[29]: # figsize = (width,height)
plt.figure(figsize = (11,5))
# orient = orientation of plot h = horizontal
sns.boxplot(data = auto_price['price'], orient = 'h')
```

[29]: <AxesSubplot:>



```
[30]: def find_outliers(df, cols):
    q1 = df[cols].quantile(.25)
    q3 = df[cols].quantile(.75)
    iqr = q3 - q1
    min_r = q1 - 1.5 * iqr
    max_r = q3 + 1.5 * iqr
    outliers_indices = df.index[(df[cols] < min_r) | (df[cols] > max_r)]
    return outliers_indices
```

```
[31]: find_outliers(auto_price, 'price')
```

[31]: Int64Index([15, 16, 17, 47, 48, 49, 70, 71, 72, 73, 74, 126, 127, 128], dtype='int64')

0.0.4 Treating Outliers

• Remove/Trim the ouliers

- Trim the data (5% to 95%)
- Mean/median apply imputation

```
[32]: import numpy as np
      from scipy import stats
[33]: auto_price_numeric = auto_price.select_dtypes(include = ['int64','float64'])
[34]: z = np.abs(stats.zscore(auto_price_numeric))
[35]: \# z-score > +3 or z-score < -3
      np.where((z > 3) | (z < -3))
[35]: (array([ 15, 17,
                         17, 28, 28, 43, 44, 45, 45, 64,
                                                                   64,
                         97, 102, 104, 122, 146, 147, 153, 154, 162, 170, 172,
                    81,
              175, 178, 180, 191]),
       array([15, 13, 14, 13, 14, 7, 7, 7, 11, 2, 7, 15, 7, 15, 13, 1, 9,
               9, 9, 10, 10, 12, 12, 10, 10, 10, 10,
                                                         1, 10, 10]))
[36]: auto_price.groupby(['make'])
[36]: <pandas.core.groupby.generic.DataFrameGroupBy object at 0x7f62ec4c1390>
[37]: auto_price.groupby(['make']).first()
[37]:
                     symboling normalized-losses fuel-type aspiration num-of-doors
      make
      alfa-romero
                              3
                                             122.0
                                                          gas
                                                                     std
                                                                                   two
      audi
                              2
                                             164.0
                                                          gas
                                                                     std
                                                                                  four
                              2
      bmw
                                             192.0
                                                                     std
                                                          gas
                                                                                   two
                              2
      chevrolet
                                             121.0
                                                          gas
                                                                     std
                                                                                   two
                              1
      dodge
                                             118.0
                                                          gas
                                                                     std
                                                                                   two
                              2
      honda
                                             137.0
                                                                     std
                                                                                   two
                                                          gas
      isuzu
                              0
                                             122.0
                                                                     std
                                                                                  four
                                                          gas
                              0
      jaguar
                                             145.0
                                                          gas
                                                                     std
                                                                                  four
                              1
      mazda
                                             104.0
                                                          gas
                                                                     std
                                                                                   two
      mercedes-benz
                             -1
                                              93.0
                                                       diesel
                                                                   turbo
                                                                                  four
      mercury
                              1
                                             122.0
                                                          gas
                                                                   turbo
                                                                                   two
      mitsubishi
                              2
                                             161.0
                                                          gas
                                                                     std
                                                                                   two
      nissan
                              1
                                             128.0
                                                          gas
                                                                     std
                                                                                   two
                              0
                                             161.0
                                                                     std
      peugot
                                                                                  four
                                                          gas
      plymouth
                              1
                                             119.0
                                                                     std
                                                          gas
                                                                                   two
                              3
      porsche
                                             186.0
                                                          gas
                                                                     std
                                                                                   two
                              3
      saab
                                             150.0
                                                                     std
                                                                                   two
                                                          gas
                              2
      subaru
                                              83.0
                                                          gas
                                                                     std
                                                                                   two
      toyota
                              1
                                              87.0
                                                          gas
                                                                     std
                                                                                   two
      volkswagen
                              2
                                             122.0
                                                       diesel
                                                                     std
                                                                                   two
```

volvo	-2	103.	0 gas	std	four
make	body-style	drive-wheels en	gine-location	wheel-base	length \
alfa-romero	convertible	rwd	front	88.6	168.8
audi	sedan	fwd	front	99.8	176.6
bmw	sedan	rwd	front	101.2	176.8
chevrolet	hatchback	fwd	front	88.4	141.1
dodge	hatchback	fwd	front	93.7	157.3
honda	hatchback	fwd	front	86.6	144.6
isuzu	sedan	rwd	front	94.3	170.7
jaguar	sedan	rwd	front	113.0	199.6
mazda	hatchback	fwd	front	93.1	159.1
mercedes-benz	sedan	rwd	front	110.0	190.9
mercury	hatchback	rwd	front	102.7	178.4
mitsubishi	hatchback	fwd	front	93.7	157.3
nissan	sedan	fwd	front	94.5	165.3
peugot	sedan	rwd	front	107.9	186.7
plymouth	hatchback	fwd	front	93.7	157.3
porsche	hatchback	rwd	front	94.5	168.9
saab	hatchback	fwd	front	99.1	186.6
subaru	hatchback	fwd	front	93.7	156.9
toyota	hatchback	fwd	front	95.7	158.7
volkswagen	sedan	fwd	front	97.3	171.7
volvo	sedan	rwd	front	104.3	188.8
molzo	engine-si	ize fuel-system	bore stroke	compression-	ratio \
make alfa-romero		l30 mpfi	3.47 2.68		9.00
audi		l30 mpfi l09 mpfi	3.47 2.08 3.40		10.00
bmw		LOS mpfi	3.50 2.80		8.80
chevrolet	1	61 2bbl	2.91 3.03		9.50
dodge	•••	90 2bb1			9.41
honda	•••	92 1bbl			9.60
isuzu		l11 2bbl			8.50
jaguar		258 mpfi			8.10
mazda	•••	91 2bbl			9.00
mercedes-benz	1	l83 idi			21.50
mercury	1	140 mpfi			8.00
mitsubishi	•••	92 2bb1			9.40
nissan		97 2bbl	3.15 3.29		9.40
peugot	1	l20 mpfi	3.46 3.19		8.40
plymouth	•••	90 2bbl	2.97 3.23		9.40
porsche	1	l51 mpfi	3.94 3.11		9.50
saab	1	l21 mpfi	3.54 3.07		9.31
subaru	•••	97 2bbl	3.62 2.36		9.00
toyota	•••	92 2bbl	3.05 3.03		9.00

volkswagen volvo		97 141		3.01 3.40 3.78 3.19			23.00 9.50
			•				
	horsepower	peak-rpm	city-mpg	highway-r	npg	price	
make							
alfa-romero	111.0	5000.0	21		27	13495.0	
audi	102.0	5500.0	24		30	13950.0	
bmw	101.0	5800.0	23		29	16430.0	
chevrolet	48.0	5100.0	47		53	5151.0	
dodge	68.0	5500.0	37		41	5572.0	
honda	58.0	4800.0	49		54	6479.0	
isuzu	78.0	4800.0	24		29	6785.0	
jaguar	176.0	4750.0	15		19	32250.0	
mazda	68.0	5000.0	30		31	5195.0	
mercedes-benz	123.0	4350.0	22		25	25552.0	
mercury	175.0	5000.0	19		24	16503.0	
mitsubishi	68.0	5500.0	37		41	5389.0	
nissan	69.0	5200.0	31		37	5499.0	
peugot	97.0	5000.0	19		24	11900.0	
plymouth	68.0	5500.0	37		41	5572.0	
porsche	143.0	5500.0	19		27	22018.0	
saab	110.0	5250.0	21		28	11850.0	
subaru	69.0	4900.0	31		36	5118.0	
toyota	62.0	4800.0	35		39	5348.0	
volkswagen	52.0	4800.0	37		46	7775.0	
volvo	114.0	5400.0	23		28	12940.0	

[21 rows x 25 columns]

[38]: auto_price.groupby(['make','body-style']).first()

[38]:			symboling	normalized-losses	fuel-type	aspiration	\
	make	body-style					
	alfa-romero	convertible	3	122.0	gas	std	
		hatchback	1	122.0	gas	std	
	audi	sedan	2	164.0	gas	std	
		wagon	1	122.0	gas	std	
	bmw	sedan	2	192.0	gas	std	
	chevrolet	hatchback	2	121.0	gas	std	
		sedan	0	81.0	gas	std	
	dodge	hatchback	1	118.0	gas	std	
		sedan	1	148.0	gas	std	
		wagon	-1	110.0	gas	std	
	honda	hatchback	2	137.0	gas	std	
		sedan	0	110.0	gas	std	
		wagon	0	78.0	gas	std	
	isuzu	hatchback	2	122.0	gas	std	

	sedan	0	122.0	gas	std
jaguar	sedan	0	145.0	gas	std
mazda	hatchback	1	104.0	gas	std
	sedan	1	113.0	gas	std
mercedes-benz	${\tt convertible}$	3	142.0	gas	std
	hardtop	0	93.0	diesel	turbo
	sedan	-1	93.0	diesel	turbo
	wagon	-1	93.0	diesel	turbo
mercury	hatchback	1	122.0	gas	turbo
mitsubishi	hatchback	2	161.0	gas	std
	sedan	1	125.0	gas	std
nissan	hardtop	2	168.0	gas	std
	hatchback	1	128.0	gas	std
	sedan	1	128.0	gas	std
	wagon	1	103.0	gas	std
peugot	sedan	0	161.0	gas	std
P-2-0-1	wagon	0	122.0	gas	std
plymouth	hatchback	1	119.0	gas	std
prymodon	sedan	1	154.0	gas	std
	wagon	-1	74.0	gas	std
porsche	convertible	3	122.0	_	std
porsche	hardtop	3	122.0	gas	std
	hatchback	3	186.0	gas	std
assh	hatchback	3	150.0	gas	
saab				gas	std
1	sedan	2	104.0	gas	std
subaru	hatchback	2	83.0	gas	std
	sedan	0	102.0	gas	std
	wagon	0	89.0	gas	std
toyota	convertible	2	134.0	gas	std
	hardtop	2	134.0	gas	std
	hatchback	1	87.0	gas	std
	sedan	0	91.0	gas	std
	wagon	0	77.0	gas	std
volkswagen	convertible	3	122.0	gas	std
	hatchback	3	256.0	gas	std
	sedan	2	122.0	diesel	std
	wagon	0	122.0	gas	std
volvo	sedan	-2	103.0	gas	std
	wagon	-1	74.0	gas	std
		num-of-doors	drive-wheels engi	ne-location	\
make	body-style				
alfa-romero	${\tt convertible}$	two	rwd	front	
	hatchback	two	rwd	front	
audi	sedan	four	fwd	front	
	wagon	four	fwd	front	
bmw	sedan	two	rwd	front	

chevrolet	hatchback	two	fwd	front
	sedan	four	fwd	front
dodge	hatchback	two	fwd	front
	sedan	four	fwd	front
	wagon	four	fwd	front
honda	hatchback	two	fwd	front
	sedan	four	fwd	front
	wagon	four	fwd	front
isuzu	hatchback	two	rwd	front
	sedan	four	rwd	front
jaguar	sedan	four	rwd	front
mazda	hatchback	two	fwd	front
	sedan	four	fwd	front
mercedes-benz	convertible	two	rwd	front
	hardtop	two	rwd	front
	sedan	four	rwd	front
	wagon	four	rwd	front
mercury	hatchback	two	rwd	front
mitsubishi	hatchback	two	fwd	front
	sedan	four	fwd	front
nissan	hardtop	two	fwd	front
	hatchback	two	fwd	front
	sedan	two	fwd	front
	wagon	four	fwd	front
peugot	sedan	four	rwd	front
	wagon	four	rwd	front
plymouth	hatchback	two	fwd	front
	sedan	four	fwd	front
	wagon	four	fwd	front
porsche	convertible	two	rwd	rear
	hardtop	two	rwd	rear
	hatchback	two	rwd	front
saab	hatchback	two	fwd	front
_	sedan	four	fwd	front
subaru	hatchback	two	fwd	front
	sedan	four	fwd	front
	wagon	four	fwd	front
toyota	convertible	two	rwd	front
	hardtop	two	rwd	front
	hatchback	two	fwd	front
	sedan	four	fwd	front
71	wagon	four	fwd	front
volkswagen	convertible	two	fwd	front
	hatchback	two	fwd	front
	sedan	two	fwd	front
1	wagon	four	fwd	front
volvo	sedan	four	rwd	front

	wagon	four		rwd		front	
	h.d	wheel-base	length	width		engine-size	\
make	body-style	00.6	168.8	64 1	•••	120	
alfa-romero	convertible	88.6		64.1	•••	130	
4 -	hatchback	94.5	171.2	65.5	•••	152	
audi	sedan	99.8	176.6	66.2	•••	109	
	wagon	105.8	192.7	71.4	•••	136	
bmw	sedan	101.2	176.8	64.8	•••	108	
chevrolet	hatchback	88.4	141.1	60.3	•••	61	
1 - 1	sedan	94.5	158.8	63.6	•••	90	
dodge	hatchback	93.7	157.3	63.8	•••	90	
	sedan	93.7	157.3	63.8	•••	90	
, ,	wagon	103.3	174.6	64.6	•••	122	
honda	hatchback	86.6	144.6	63.9	•••	92	
	sedan	96.5	163.4	64.0	•••	92	
	wagon	96.5	157.1	63.9	•••	92	
isuzu	hatchback	96.0	172.6	65.2	•••	119	
	sedan	94.3	170.7	61.8	•••	111	
jaguar -	sedan	113.0	199.6	69.6	•••	258	
mazda	hatchback	93.1	159.1	64.2	•••	91	
	sedan	93.1	166.8	64.2	•••	91	
mercedes-benz		96.6	180.3	70.5	•••	234	
	hardtop	106.7	187.5	70.3	•••	183	
	sedan	110.0	190.9	70.3	•••	183	
	wagon	110.0	190.9	70.3	•••	183	
mercury	hatchback	102.7	178.4	68.0	•••	140	
mitsubishi	hatchback	93.7	157.3	64.4	•••	92	
	sedan	96.3	172.4	65.4	•••	122	
nissan	hardtop	95.1	162.4	63.8	•••	97	
	hatchback	94.5	165.6	63.8	•••	97	
	sedan	94.5	165.3	63.8	•••	97	
	wagon	94.5	170.2	63.8	•••	97	
peugot	sedan	107.9	186.7	68.4	•••	120	
	wagon	114.2	198.9	68.4	•••	120	
plymouth	hatchback	93.7	157.3	63.8	•••	90	
	sedan	93.7	167.3	63.8	•••	90	
	wagon	103.3	174.6	64.6	•••	122	
porsche	convertible	89.5	168.9	65.0	•••	194	
	hardtop	89.5	168.9	65.0	•••	194	
	hatchback	94.5	168.9	68.3	•••	151	
saab	hatchback	99.1	186.6	66.5	•••	121	
	sedan	99.1	186.6	66.5	•••	121	
subaru	hatchback	93.7	156.9	63.4	•••	97	
	sedan	97.2	172.0	65.4	•••	108	
	wagon	97.0	173.5	65.4	•••	108	
toyota	convertible	98.4	176.2	65.6	•••	146	

	hardtop	98.4	176.2	65.6	1	46
	hatchback	95.7	158.7	63.6	•••	92
	sedan	95.7	166.3	64.4	•••	98
	wagon	95.7	169.7	63.6		92
volkswagen	convertible	94.5	159.3	64.2		09
	hatchback	94.5	165.7	64.0		09
	sedan	97.3	171.7	65.5		97
	wagon	100.4	183.1	66.9		09
volvo	sedan	104.3	188.8	67.2		41
VO1VO	wagon	104.3	188.8	67.2		41
	wagon	104.0	100.0	01.2		TI
		fuel-system	bore s	stroke	compression-r	atio '
make	body-style	J			1	
alfa-romero	convertible	mpfi	3.47	2.68		9.00
	hatchback	mpfi	2.68	3.47		9.00
audi	sedan	mpfi		3.40		0.00
addi	wagon	mpfi		3.40		8.50
bmw	sedan	mpfi	3.50	2.80		8.80
chevrolet	hatchback	2bbl	2.91	3.03		9.50
CHEVIOLEC	sedan	2bb1	3.03	3.11		9.60
dodgo	hatchback	2bb1	2.97	3.23		9.41
dodge	sedan	2bb1 2bb1	2.97	3.23		9.40
h d .	wagon	2bbl	3.34	3.46		8.50
honda	hatchback	1bbl	2.91	3.41		9.60
	sedan	1bbl	2.91	3.41		9.20
	wagon	1bbl	2.92	3.41		9.20
isuzu	hatchback	spfi	3.43	3.23		9.20
	sedan	2bbl	3.31	3.23		8.50
jaguar	sedan	mpfi		4.17		8.10
mazda	hatchback	2bb1	3.03	3.15		9.00
	sedan	2bb1	3.03	3.15		9.00
mercedes-benz		mpfi	3.46	3.10	;	8.30
	hardtop	idi	3.58	3.64	2	1.50
	sedan	idi	3.58	3.64		1.50
	wagon	idi	3.58	3.64	2	1.50
mercury	hatchback	mpfi	3.78	3.12	;	8.00
mitsubishi	hatchback	2bbl	2.97	3.23	!	9.40
	sedan	2bbl	3.35	3.46		8.50
nissan	hardtop	2bbl	3.15	3.29	!	9.40
	hatchback	2bbl	3.15	3.29	!	9.40
	sedan	2bbl	3.15	3.29		9.40
	wagon	2bbl	3.15	3.29		9.40
peugot	sedan	mpfi		3.19	;	8.40
- -	wagon	mpfi		3.19	;	8.40
plymouth	hatchback	2bbl	2.97	3.23		9.40
	sedan	2bbl	2.97	3.23		9.40
	wagon	2bbl	3.35	3.46		8.50
	- G / 		- · - •			

porsche	convertible	mpf	i 3.74	2.90	9.50	
	hardtop	mpf	i 3.74	2.90	9.50	
	hatchback	mpf	i 3.94	3.11	9.50	
saab	hatchback	mpf	i 3.54	3.07	9.31	
	sedan	mpf	i 3.54	3.07	9.30	
subaru	hatchback	2bb]	1 3.62	2.36	9.00	
	sedan	2bb]	1 3.62	2.64	9.50	
	wagon	2bb]	1 3.62	2.64	9.00	
toyota	${\tt convertible}$	mpf	i 3.62	3.50	9.30	
	hardtop	mpf	i 3.62	3.50	9.30	
	hatchback	2bb]	1 3.05	3.03	9.00	
	sedan	2bb]	l 3.19	3.03	9.00	
	wagon	2bb]	1 3.05	3.03	9.00	
volkswagen	convertible	mpfi	i 3.19	3.40	8.50	
_	hatchback	mpf	i 3.19	3.40	8.50	
	sedan	id	i 3.01	3.40	23.00	
	wagon	mpfi	i 3.19	3.40	9.00	
volvo	sedan	mpf	i 3.78	3.15	9.50	
	wagon	mpfi		3.15	9.50	
		_				
		horsepower	peak-rpm	city-mpg	highway-mpg	price
make	body-style					
alfa-romero	${\tt convertible}$	111.0	5000.0	21	27	13495.0
	hatchback	154.0	5000.0	19	26	16500.0
audi	sedan	102.0	5500.0	24	30	13950.0
	wagon	110.0	5500.0	19	25	18920.0
bmw	sedan	101.0	5800.0	23	29	16430.0
chevrolet	hatchback	48.0	5100.0	47	53	5151.0
	sedan	70.0	5400.0	38	43	6575.0
dodge	hatchback	68.0	5500.0	37	41	5572.0
	sedan	68.0	5500.0	31	38	6692.0
	wagon	88.0	5000.0	24	30	8921.0
honda	hatchback	58.0	4800.0	49	54	6479.0
	sedan	76.0	6000.0	30	34	7295.0
	wagon	76.0	6000.0	30	34	7295.0
isuzu	hatchback	90.0	5000.0	24	29	11048.0
	sedan	78.0	4800.0	24	29	6785.0
jaguar	sedan	176.0	4750.0	15	19	32250.0
mazda	hatchback	68.0	5000.0	30	31	5195.0
	sedan	68.0	5000.0	31	38	6695.0
mercedes-benz	${\tt convertible}$	155.0	4750.0	16	18	35056.0
	hardtop	123.0	4350.0	22	25	28176.0
	sedan	123.0	4350.0	22	25	25552.0
	wagon	123.0	4350.0	22	25	28248.0
mercury	hatchback	175.0	5000.0	19	24	16503.0
mitsubishi	hatchback	68.0	5500.0	37	41	5389.0
	sedan	88.0	5000.0	25	32	6989.0

nissan	hardtop	69.0	5200.0	31	37	8249.0
	hatchback	69.0	5200.0	31	37	7799.0
	sedan	69.0	5200.0	31	37	5499.0
	wagon	69.0	5200.0	31	37	7349.0
peugot	sedan	97.0	5000.0	19	24	11900.0
	wagon	97.0	5000.0	19	24	12440.0
plymouth	hatchback	68.0	5500.0	37	41	5572.0
	sedan	68.0	5500.0	31	38	6692.0
	wagon	88.0	5000.0	24	30	8921.0
porsche	convertible	207.0	5900.0	17	25	37028.0
	hardtop	207.0	5900.0	17	25	32528.0
	hatchback	143.0	5500.0	19	27	22018.0
saab	hatchback	110.0	5250.0	21	28	11850.0
	sedan	110.0	5250.0	21	28	12170.0
subaru	hatchback	69.0	4900.0	31	36	5118.0
	sedan	82.0	4800.0	32	37	7126.0
	wagon	82.0	4800.0	28	32	7463.0
toyota	convertible	116.0	4800.0	24	30	17669.0
	hardtop	116.0	4800.0	24	30	8449.0
	hatchback	62.0	4800.0	35	39	5348.0
	sedan	70.0	4800.0	30	37	6938.0
	wagon	62.0	4800.0	31	37	6918.0
volkswagen	convertible	90.0	5500.0	24	29	11595.0
	hatchback	90.0	5500.0	24	29	9980.0
	sedan	52.0	4800.0	37	46	7775.0
	wagon	88.0	5500.0	25	31	12290.0
volvo	sedan	114.0	5400.0	23	28	12940.0
	wagon	114.0	5400.0	23	28	13415.0

[53 rows x 24 columns]

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