Math 189: Homework 5

Auto Mileage

In this assignment you will develop a model to predict whether a given car gets high or low gas mileage based on the Auto data set. This data can be found in the ISLR package.

Introduction

In this learning assignment for Math 189, we use a dataset (Auto) from the ISLR library to build a model which predicts whether a given car will have high or low gas mileage. To build this classification model, we conducted an linear discriminant analysis (LDA) on our training data to find the linear combination of features which will characterize the cars into one of two classes (0 = low gas mileage, 1= high gas mileage). Finally, using the model, we classified the test data and measured its accuracy.

Data

This dataset is taken from the ISLR package library and is known as "Auto". It contains 392 observations on automobiles taken from various years. For each automobile, the miles per gallon (MPG), horsepower, weight, number of cylinders, displacement, acceleration, year, origin and name is recorded. [Insert head(Auto)]

Tasks

Analyze the dataset according to the following steps:

- 1. Create a binary variable, mgp01, that contains 1 if mpg contains a value above its median, and a 0 if mpg contains a value below its median. You can compute the median using the median() function.
- 2. Explore the data graphically in order to investigate the association between mgp01 and the other features. Which of the other features seem most likely to be useful in predicting mgp01? Scatterplots and boxplots may be useful tools to answer this question. Describe your findings.
- 3. Split the data into a training set of size 300 and a test set of size 92.
- 4. Perform LDA on the training data in order to predict mgp01 using the variables that seemed most associated with mgp01.
- 5. Classify the test data. Discuss the results in terms of the proportion of correctly classified records.

```
library(ISLR)
data(Auto)
head(Auto)
```

##		mpg	cylinders	displacement	horsepower	weight	acceleration	year	origin
##	1	18	8	307	130	3504	12.0	70	1
##	2	15	8	350	165	3693	11.5	70	1
##	3	18	8	318	150	3436	11.0	70	1

```
## 4
      16
                               304
                                           150
                                                  3433
                                                                 12.0
                                                                         70
                                                                                  1
                                                                 10.5
## 5
      17
                   8
                               302
                                           140
                                                  3449
                                                                         70
                                                                                  1
##
   6
      15
                   8
                               429
                                           198
                                                  4341
                                                                 10.0
                                                                         70
                                                                                  1
##
                             name
## 1 chevrolet chevelle malibu
## 2
              buick skylark 320
## 3
             plymouth satellite
## 4
                   amc rebel sst
## 5
                     ford torino
## 6
               ford galaxie 500
```

The dataset has 392 observations on automobiles. For each automobile, we record the miles per gallon (MPG), among other variables such as horsepower and weight.

Methods and Analysis

First, we had to create another column (mpg01) in which to put whether the mpg for each car was above or below the median (22.75mpg) using a for loop and if statements. Next, we demonstrate both a boxplot and a paired scatterplot in order to determine which variables would be most useful for predictions. We chose to use number of cylinders, displacement, horsepower, weight, and year as they seemed the most indicative toward mpg01. Then, we perform the whole process of LDA (Linear Discriminant Analysis). First, we separate the table into 300 training samples and 92 test samples for ease. We must then choose the prior for both mpg above 22.75 and mpg below 22.75. For this, we simply did training data priors by dividing the number of samples in each over the total. Then, we calculated the column means and covariance for each separated matrix of variable values. We then found the pooled sample covariance matrix from the two and found its inverse. Using matrix multiplication, we calculated alpha and beta using the mean matrices, the inverse pooled sample covariance matrix, and the log of the priors. Now, after we have all these matrices calculated, we have to do the predictions. For this, we estimate the linear discrimination function by adding alpha plus transpose beta and matrix multiplying by the transpose of the variables we used. Then, we classify the prediction into whichever group has the higher linear discrimination function. Finally, to easily view the results, we placed them into a table containing the number of total observations, the number of correct predictions, and the number of incorrect predictions for both mpg1 (above 22.75mpg) and mpg0 (below 22.75mpg).

```
med_mpg = median(Auto$mpg)
med_mpg
```

[1] 22.75

```
Auto$mpg01 = NULL
head(Auto)
```

```
##
          cylinders displacement horsepower weight acceleration year origin
     mpg
                                                                          70
##
      18
                   8
                                307
                                            130
                                                   3504
                                                                  12.0
                                                                                   1
##
      15
                   8
                                350
                                            165
                                                   3693
                                                                  11.5
                                                                          70
                                                                                   1
                   8
                                                                          70
##
   3
      18
                                318
                                            150
                                                   3436
                                                                  11.0
                                                                                   1
      16
                   8
                                304
                                            150
                                                   3433
                                                                          70
                                                                                   1
##
                                                                  12.0
## 5
                   8
      17
                                302
                                            140
                                                   3449
                                                                  10.5
                                                                          70
                                                                                   1
##
  6
                   8
                                429
                                            198
                                                   4341
                                                                  10.0
                                                                          70
                                                                                   1
##
## 1 chevrolet chevelle malibu
## 2
              buick skylark 320
```

```
## 3
            plymouth satellite
                 amc rebel sst
## 4
## 5
                   ford torino
## 6
              ford galaxie 500
for(i in 1:392){
  if(Auto[i,1]>22.75){
    Auto[i,10] = 1
  if(Auto[i,1]<22.75){
    Auto[i,10] = 0
  }
}
colnames(Auto)[10] = "mpg01"
Auto
```

```
##
        mpg cylinders displacement horsepower weight acceleration year origin
## 1
                      8
                                307.0
                                               130
                                                      3504
                                                                     12.0
                                                                            70
       18.0
                                                                                      1
## 2
       15.0
                      8
                                350.0
                                               165
                                                      3693
                                                                     11.5
                                                                             70
                                                                                      1
                                318.0
## 3
       18.0
                      8
                                               150
                                                      3436
                                                                     11.0
                                                                             70
                                                                                      1
## 4
       16.0
                      8
                                304.0
                                               150
                                                      3433
                                                                     12.0
                                                                                      1
                                                                             70
## 5
       17.0
                      8
                                302.0
                                               140
                                                      3449
                                                                     10.5
                                                                             70
                                                                                      1
## 6
       15.0
                      8
                                429.0
                                               198
                                                      4341
                                                                     10.0
                                                                            70
                                                                                      1
## 7
                      8
                                               220
                                                                      9.0
                                                                            70
       14.0
                                454.0
                                                      4354
                                                                                      1
## 8
                      8
       14.0
                                440.0
                                               215
                                                      4312
                                                                      8.5
                                                                            70
                                                                                      1
## 9
       14.0
                      8
                                               225
                                                      4425
                                                                             70
                                                                                      1
                                455.0
                                                                     10.0
## 10
       15.0
                      8
                                390.0
                                               190
                                                      3850
                                                                      8.5
                                                                             70
                                                                                      1
## 11
                      8
                                                                             70
       15.0
                                383.0
                                               170
                                                      3563
                                                                     10.0
                                                                                      1
## 12
       14.0
                      8
                                340.0
                                               160
                                                      3609
                                                                      8.0
                                                                             70
                                                                                      1
                      8
## 13
       15.0
                                400.0
                                               150
                                                      3761
                                                                      9.5
                                                                             70
                                                                                      1
## 14
       14.0
                      8
                                455.0
                                               225
                                                      3086
                                                                     10.0
                                                                            70
                                                                                      1
## 15
       24.0
                      4
                                113.0
                                                95
                                                      2372
                                                                     15.0
                                                                            70
                                                                                      3
## 16
                      6
       22.0
                                198.0
                                                95
                                                      2833
                                                                     15.5
                                                                            70
                                                                                      1
## 17
       18.0
                      6
                                199.0
                                                97
                                                      2774
                                                                     15.5
                                                                             70
                                                                                      1
                      6
## 18
       21.0
                                200.0
                                                85
                                                      2587
                                                                            70
                                                                                      1
                                                                     16.0
## 19
       27.0
                      4
                                 97.0
                                                88
                                                      2130
                                                                     14.5
                                                                             70
                                                                                      3
## 20
       26.0
                      4
                                                46
                                                                     20.5
                                                                             70
                                                                                      2
                                 97.0
                                                      1835
## 21
       25.0
                      4
                                                87
                                                                                      2
                                110.0
                                                      2672
                                                                     17.5
                                                                            70
                                                                                      2
## 22
       24.0
                      4
                                107.0
                                                90
                                                      2430
                                                                     14.5
                                                                            70
## 23
                      4
                                                                                      2
       25.0
                                104.0
                                                95
                                                      2375
                                                                     17.5
                                                                            70
                                                                                      2
## 24
       26.0
                      4
                                121.0
                                               113
                                                      2234
                                                                     12.5
                                                                            70
## 25
       21.0
                      6
                                199.0
                                                90
                                                      2648
                                                                     15.0
                                                                             70
                                                                                      1
## 26
       10.0
                      8
                                360.0
                                               215
                                                                             70
                                                      4615
                                                                     14.0
                                                                                      1
                      8
## 27
       10.0
                                307.0
                                               200
                                                      4376
                                                                     15.0
                                                                             70
                                                                                      1
## 28
                      8
       11.0
                                318.0
                                               210
                                                      4382
                                                                     13.5
                                                                             70
                                                                                      1
## 29
        9.0
                      8
                                304.0
                                               193
                                                      4732
                                                                     18.5
                                                                            70
                                                                                      1
## 30
       27.0
                      4
                                 97.0
                                                88
                                                      2130
                                                                     14.5
                                                                             71
                                                                                      3
## 31
                      4
                                                90
                                                                     15.5
                                                                                      1
       28.0
                                140.0
                                                      2264
                                                                            71
## 32
       25.0
                      4
                                113.0
                                                95
                                                      2228
                                                                     14.0
                                                                             71
                                                                                      3
## 34
       19.0
                      6
                                                                            71
                                232.0
                                               100
                                                      2634
                                                                     13.0
                                                                                      1
## 35
       16.0
                      6
                                225.0
                                               105
                                                      3439
                                                                     15.5
                                                                            71
                                                                                      1
                      6
                                               100
                                                                            71
## 36
       17.0
                                250.0
                                                      3329
                                                                     15.5
                                                                                      1
## 37
       19.0
                      6
                                250.0
                                                88
                                                      3302
                                                                            71
                                                                                      1
                                                                     15.5
                      6
                                               100
                                                      3288
## 38
      18.0
                                232.0
                                                                     15.5
                                                                            71
                                                                                      1
```

## 39	14.0	0	350.0	165	4209	12.0	71	1
## 40		8 8	400.0				71	
	14.0			175	4464	11.5		1
## 41	14.0	8	351.0	153	4154	13.5	71	1
## 42	14.0	8	318.0	150	4096	13.0	71	1
## 43	12.0	8	383.0	180	4955	11.5	71	1
## 44	13.0	8	400.0	170	4746	12.0	71	1
## 45	13.0	8	400.0	175	5140	12.0	71	1
## 46	18.0	6	258.0	110	2962	13.5	71	1
## 47	22.0	4	140.0	72	2408	19.0	71	1
## 48	19.0	6	250.0	100	3282	15.0	71	1
## 49	18.0	6	250.0	88	3139	14.5	71	1
## 50	23.0	4	122.0	86	2220	14.0	71	1
## 51	28.0	4	116.0	90	2123	14.0	71	2
## 52	30.0	4	79.0	70	2074	19.5	71	2
## 53	30.0	4	88.0	76	2065	14.5	71	2
## 54	31.0	4	71.0	65	1773	19.0	71	3
## 55	35.0	4	72.0	69	1613	18.0	71	3
## 56	27.0	4	97.0	60	1834	19.0	71	2
## 57	26.0	4	91.0	70	1955	20.5	71	1
## 58	24.0	4	113.0	95	2278	15.5	72	3
## 59	25.0	4	97.5	80	2126	17.0	72	1
## 60	23.0	4	97.0	54	2254	23.5	72	2
## 60	20.0	4	140.0	90	2408	19.5	72	1
## 61	21.0							
		4	122.0	86 165	2226	16.5	72 70	1
## 63	13.0	8	350.0	165	4274	12.0	72	1
## 64	14.0	8	400.0	175	4385	12.0	72 70	1
## 65	15.0	8	318.0	150	4135	13.5	72	1
## 66	14.0	8	351.0	153	4129	13.0	72	1
## 67	17.0	8	304.0	150	3672	11.5	72	1
## 68	11.0	8	429.0	208	4633	11.0	72	1
## 69	13.0	8	350.0	155	4502	13.5	72	1
## 70	12.0	8	350.0	160	4456	13.5	72	1
## 71	13.0	8	400.0	190	4422	12.5	72	1
## 72	19.0	3	70.0	97	2330	13.5	72	3
## 73	15.0	8	304.0	150	3892	12.5	72	1
## 74	13.0	8	307.0	130	4098	14.0	72	1
## 75	13.0	8	302.0	140	4294	16.0	72	1
## 76	14.0	8	318.0	150	4077	14.0	72	1
## 77	18.0	4	121.0	112	2933	14.5	72	2
## 78	22.0	4	121.0	76	2511	18.0	72	2
## 79	21.0	4	120.0	87	2979	19.5	72	2
## 80	26.0	4	96.0	69	2189	18.0	72	2
## 81	22.0	4	122.0	86	2395	16.0	72	1
## 82	28.0	4	97.0	92	2288	17.0	72	3
## 83	23.0	4	120.0	97	2506	14.5	72	3
## 84	28.0	4	98.0	80	2164	15.0	72	1
## 85	27.0	4	97.0	88	2100	16.5	72	3
## 86	13.0	8	350.0	175	4100	13.0	73	1
## 87	14.0	8	304.0	150	3672	11.5	73	1
## 88	13.0	8	350.0	145	3988	13.0	73	1
## 89	14.0	8	302.0	137	4042	14.5	73	1
## 90	15.0	8	318.0	150	3777	12.5	73	1
## 91	12.0	8	429.0	198	4952	11.5	73	1
## 92	13.0	8	400.0	150	4464	12.0	73	1
02		•		-00			. •	-

## 93	3 13		351.0	158	4363	13.0	73	1
## 94	4 14	.0 8	318.0	150	4237	14.5	73	1
## 95	5 13	.0 8	440.0	215	4735	11.0	73	1
## 96	6 12	.0 8	455.0	225	4951	11.0	73	1
## 97			360.0	175	3821	11.0	73	1
## 98			225.0	105	3121	16.5	73	1
## 99			250.0	100	3278	18.0	73	1
	00 18		232.0	100	2945	16.0	73	1
	01 18		250.0	88	3021	16.5	73	1
	02 23		198.0	95	2904	16.0	73	1
	03 26		97.0	46	1950	21.0	73	2
	04 11		400.0	150	4997	14.0	73	1
	05 12		400.0	167	4906	12.5	73	1
	06 13		360.0	170	4654	13.0	73	1
	07 12		350.0	180	4499	12.5	73	1
	08 18		232.0	100	2789	15.0	73	1
	09 20		97.0	88	2279	19.0	73	3
	10 21		140.0	72	2401	19.5	73	1
## 11	11 22	.0 4	108.0	94	2379	16.5	73	3
## 11	12 18	.0 3	70.0	90	2124	13.5	73	3
## 11	13 19	.0 4	122.0	85	2310	18.5	73	1
## 11	14 21	.0 6	155.0	107	2472	14.0	73	1
## 11	15 26	.0 4	98.0	90	2265	15.5	73	2
## 11	16 15	.0 8	350.0	145	4082	13.0	73	1
## 11	17 16	.0 8	400.0	230	4278	9.5	73	1
	18 29		68.0	49	1867	19.5	73	2
	19 24		116.0	75	2158	15.5	73	2
	20 20		114.0	91	2582	14.0	73	2
	21 19		121.0	112	2868	15.5	73	2
	22 15		318.0	150	3399	11.0	73	1
	23 24		121.0	110	2660	14.0	73	2
	23 24 24 20		156.0	122	2807	13.5	73	3
	24 20 25 11						73 73	
			350.0	180	3664	11.0		1
	26 20		198.0	95	3102	16.5	74	1
	28 19		232.0	100	2901	16.0	74	1
	29 15		250.0	100	3336	17.0	74	1
	30 31		79.0	67	1950	19.0	74	3
	31 26		122.0	80	2451	16.5	74	1
	32 32		71.0	65	1836	21.0	74	3
	33 25		140.0	75	2542	17.0	74	1
	34 16		250.0	100	3781	17.0	74	1
## 13	35 16	.0 6	258.0	110	3632	18.0	74	1
## 13	36 18	.0 6	225.0	105	3613	16.5	74	1
## 13	37 16	.0 8	302.0	140	4141	14.0	74	1
## 13	38 13	.0 8	350.0	150	4699	14.5	74	1
## 13	39 14	.0 8	318.0	150	4457	13.5	74	1
## 14	40 14	.0 8	302.0	140	4638	16.0	74	1
## 14	41 14	.0 8	304.0	150	4257	15.5	74	1
	42 29		98.0	83	2219	16.5	74	2
	43 26		79.0	67	1963	15.5	74	2
	44 26		97.0	78	2300	14.5	74	2
	45 31		76.0	52	1649	16.5	74	3
	46 32		83.0	61	2003	19.0	74	3
	47 28		90.0	75	2125	14.5	74	1
1			50.0	, 0	2120	11.0		-

## 148 24.	.0 4	90.0	75	2108	15.5	74	2
## 149 26.	.0 4	116.0	75	2246	14.0	74	2
## 150 24.	.0 4	120.0	97	2489	15.0	74	3
## 151 26.	.0 4	108.0	93	2391	15.5	74	3
## 152 31.	.0 4	79.0	67	2000	16.0	74	2
## 153 19.	.0 6	225.0	95	3264	16.0	75	1
## 154 18.		250.0	105	3459	16.0	75	1
## 155 15.		250.0	72	3432	21.0	75	1
## 156 15.		250.0	72	3158	19.5	75	1
## 157 16.	.0 8	400.0	170	4668	11.5	75	1
## 158 15.	.0 8	350.0	145	4440	14.0	75	1
## 159 16.	.0 8	318.0	150	4498	14.5	75	1
## 160 14.	.0 8	351.0	148	4657	13.5	75	1
## 161 17.	.0 6	231.0	110	3907	21.0	75	1
## 162 16.	.0 6	250.0	105	3897	18.5	75	1
## 163 15.	.0 6	258.0	110	3730	19.0	75	1
## 164 18.	.0 6	225.0	95	3785	19.0	75	1
## 165 21.	.0 6	231.0	110	3039	15.0	75	1
## 166 20.	.0 8	262.0	110	3221	13.5	75	1
## 167 13.	.0 8	302.0	129	3169	12.0	75	1
## 168 29.	.0 4	97.0	75	2171	16.0	75	3
## 169 23.		140.0	83	2639	17.0	75	1
## 170 20.	.0 6	232.0	100	2914	16.0	75	1
## 171 23.		140.0	78	2592	18.5	75	1
## 172 24.		134.0	96	2702	13.5	75	3
## 173 25.	.0 4	90.0	71	2223	16.5	75	2
## 174 24.		119.0	97	2545	17.0	75	3
## 175 18.		171.0	97	2984	14.5	75	1
## 176 29.		90.0	70	1937	14.0	75	2
## 177 19.		232.0	90	3211	17.0	75	1
## 178 23.		115.0	95	2694	15.0	75	2
## 179 23.		120.0	88	2957	17.0	75	2
## 180 22.		121.0	98	2945	14.5	75	2
## 181 25.		121.0	115	2671	13.5	75	2
## 182 33.		91.0	53	1795	17.5	75	3
## 183 28.		107.0	86	2464	15.5	76	2
## 184 25.		116.0	81	2220	16.9	76	2
## 185 25.		140.0	92	2572	14.9	76	1
## 186 26.		98.0	79	2255	17.7	76	1
## 187 27.		101.0	83	2202	15.3	76	2
## 188 17.		305.0	140	4215	13.0	76	1
## 189 16.		318.0	150	4190	13.0	76	1
## 190 15. ## 191 14.		304.0	120	3962	13.9 12.8	76 76	1 1
## 191 14. ## 192 22.		351.0 225.0	152 100	4215 3233	15.4	76	1
## 192 22. ## 193 22.		250.0	105	3353	14.5	76	1
## 193 22. ## 194 24.		200.0	81	3012	17.6	76	1
## 19 4 24. ## 195 22.		232.0	90	3012	17.6	76	1
## 195 22. ## 196 29.		85.0	52	2035	22.2	76	1
## 190 29. ## 197 24.		98.0	60	2164	22.1	76	1
## 197 24. ## 198 29.		90.0	70	1937	14.2	76	2
## 190 29. ## 199 33.		91.0	53	1795	17.4	76	3
## 200 20.		225.0	100	3651	17.7	76	1
## 201 18.		250.0	78	3574	21.0	76	1
			. 3		21.0	. •	-

## 202 18.5	6	250.0	110	3645	16.2	76	1
## 203 17.5	6	258.0	95	3193	17.8	76	1
## 204 29.5	4	97.0	71	1825	12.2	76	2
## 205 32.0	4	85.0	70	1990	17.0	76	3
## 206 28.0	4	97.0	75	2155	16.4	76	3
## 207 26.5	4	140.0	72	2565	13.6	76	1
## 207 20.3	4			3150			2
		130.0	102		15.7	76	
## 209 13.0	8	318.0	150	3940	13.2	76	1
## 210 19.0	4	120.0	88	3270	21.9	76	2
## 211 19.0	6	156.0	108	2930	15.5	76	3
## 212 16.5	6	168.0	120	3820	16.7	76	2
## 213 16.5	8	350.0	180	4380	12.1	76	1
## 214 13.0	8	350.0	145	4055	12.0	76	1
## 215 13.0	8	302.0	130	3870	15.0	76	1
## 216 13.0	8	318.0	150	3755	14.0	76	1
## 217 31.5	4	98.0	68	2045	18.5	77	3
## 218 30.0	4	111.0	80	2155	14.8	77	1
## 219 36.0	4	79.0	58	1825	18.6	77	2
## 220 25.5	4	122.0	96	2300	15.5	77	1
## 221 33.5	4	85.0	70	1945	16.8	77	3
## 222 17.5	8	305.0	145	3880	12.5	77	1
## 223 17.0	8	260.0	110	4060	19.0	77	1
	8	318.0	145	4140	13.7	77 77	1
## 225 15.0	8	302.0	130	4295	14.9	77 77	1
## 226 17.5	6	250.0	110	3520	16.4	77	1
## 227 20.5	6	231.0	105	3425	16.9	77	1
## 228 19.0	6	225.0	100	3630	17.7	77	1
## 229 18.5	6	250.0	98	3525	19.0	77	1
## 230 16.0	8	400.0	180	4220	11.1	77	1
## 231 15.5	8	350.0	170	4165	11.4	77	1
## 232 15.5	8	400.0	190	4325	12.2	77	1
## 233 16.0	8	351.0	149	4335	14.5	77	1
## 234 29.0	4	97.0	78	1940	14.5	77	2
## 235 24.5	4	151.0	88	2740	16.0	77	1
## 236 26.0	4	97.0	75	2265	18.2	77	3
## 237 25.5	4	140.0	89	2755	15.8	77	1
## 238 30.5	4	98.0	63	2051	17.0	77	1
## 239 33.5	4	98.0	83	2075	15.9	77	1
## 240 30.0	4	97.0	67	1985	16.4	77	3
## 241 30.5	4	97.0	78	2190	14.1	77	2
## 242 22.0	6	146.0	97	2815	14.5	77	3
				2600			2
## 243 21.5	4	121.0	110		12.8	77 77	
## 244 21.5	3	80.0	110	2720	13.5	77	3
## 245 43.1	4	90.0	48	1985	21.5	78	2
## 246 36.1	4	98.0	66	1800	14.4	78	1
## 247 32.8	4	78.0	52	1985	19.4	78	3
## 248 39.4	4	85.0	70	2070	18.6	78	3
## 249 36.1	4	91.0	60	1800	16.4	78	3
## 250 19.9	8	260.0	110	3365	15.5	78	1
## 251 19.4	8	318.0	140	3735	13.2	78	1
## 252 20.2	8	302.0	139	3570	12.8	78	1
## 253 19.2	6	231.0	105	3535	19.2	78	1
## 254 20.5	6	200.0	95	3155	18.2	78	1
## 255 20.2	6	200.0	85	2965	15.8	78	1
-	-					-	

## 256 25.1	4	140.0	88	2720	15.4	78	1
## 257 20.5	6	225.0	100	3430	17.2	78	1
## 258 19.4	6	232.0	90	3210	17.2	78	1
## 259 20.6	6	231.0	105	3380	15.8	78	1
## 260 20.8	6	200.0	85	3070	16.7	78	1
## 261 18.6	6	225.0	110	3620	18.7	78	1
## 262 18.1	6	258.0	120	3410	15.1	78	1
## 263 19.2	8	305.0	145	3425	13.2	78	1
## 264 17.7	6	231.0	165	3445	13.4	78	1
## 265 18.1	8	302.0	139	3205	11.2	78	1
## 266 17.5	8	318.0	140	4080	13.7	78	1
## 267 30.0	4	98.0	68	2155	16.5	78	1
## 268 27.5	4	134.0	95	2560	14.2	78	3
## 269 27.2	4	119.0	97	2300	14.7	78	3
## 270 30.9	4	105.0	75	2230	14.5	78	1
## 271 21.1	4	134.0	95	2515	14.8	78	3
## 272 23.2	4	156.0	105	2745	16.7	78	1
## 273 23.8	4	151.0	85	2855	17.6	78	1
## 274 23.9	4	119.0	97	2405	14.9	78	3
## 275 20.3	5	131.0	103	2830	15.9	78	2
## 276 17.0	6	163.0	125	3140	13.6	78	2
## 277 21.6	4	121.0	115	2795	15.7	78	2
## 278 16.2	6	163.0	133	3410	15.8	78	2
## 279 31.5	4	89.0	71	1990	14.9	78	2
## 280 29.5	4	98.0	68	2135	16.6	78	3
## 280 29.5 ## 281 21.5	6	231.0	115	3245	15.4	79	1
## 282 19.8	6	200.0	85	2990	18.2	79	1
## 283 22.3	4	140.0	88	2890	17.3	79	1
## 284 20.2	6	232.0	90	3265	18.2	79	1
## 285 20.6	6	232.0	110	3360	16.6	79	1
## 286 17.0	8	305.0	130	3840	15.4	79	1
## 287 17.6	8	302.0	129	3725	13.4	79	1
## 288 16.5	8	351.0	138	3955	13.4	79	1
## 289 18.2	8	318.0	135	3830	15.2	79	1
## 290 16.9	8	350.0	155	4360	14.9	79	1
## 291 15.5	8	351.0	142	4054	14.3	79	1
## 292 19.2	8	267.0	125	3605	15.0	79	1
## 293 18.5	8	360.0	150	3940	13.0	79	1
## 294 31.9	4	89.0	71	1925	14.0	79	2
## 295 34.1	4	86.0	65	1975	15.2	79	3
## 296 35.7	4	98.0	80	1915	14.4	79	1
## 297 27.4	4	121.0	80	2670	15.0	79	1
## 298 25.4	5	183.0	77	3530	20.1	79	2
## 299 23.0	8	350.0	125	3900	17.4	79	1
## 300 27.2	4	141.0	71	3190	24.8	79	2
## 301 23.9	8	260.0	90	3420	22.2	79	1
## 302 34.2	4	105.0	70	2200	13.2	79	1
## 303 34.5	4	105.0	70	2150	14.9	79	1
## 304 31.8	4	85.0	65	2020	19.2	79	3
## 305 37.3	4	91.0	69	2130	14.7	79	2
## 306 28.4	4	151.0	90	2670	16.0	79	1
## 307 28.8	6	173.0	115	2595	11.3	79	1
## 308 26.8	6	173.0	115	2700	12.9	79	1
## 309 33.5	4	151.0	90	2556	13.2	79	1
500 50.0	£	101.0	30	2000	10.2	, ,	_

## 310 41.5	4	98.0	76	2144	14.7	80	2
## 311 38.1	4	89.0	60	1968	18.8	80	3
## 312 32.1	4	98.0	70	2120	15.5	80	1
## 313 37.2	4	86.0	65	2019	16.4	80	3
## 314 28.0	4	151.0	90	2678	16.5	80	1
## 315 26.4	4	140.0	88	2870	18.1	80	1
## 316 24.3	4	151.0	90	3003	20.1	80	1
## 317 19.1	6	225.0	90	3381	18.7	80	1
## 318 34.3	4	97.0	78	2188	15.8	80	2
## 319 29.8	4	134.0	90	2711	15.5	80	3
## 320 31.3	4	120.0	75	2542	17.5	80	3
## 321 37.0	4	119.0	92	2434	15.0	80	3
## 322 32.2	4	108.0	75	2265	15.2	80	3
## 323 46.6	4	86.0	65	2110	17.9	80	3
## 324 27.9	4	156.0	105	2800	14.4	80	1
## 325 40.8	4	85.0	65	2110	19.2	80	3
## 326 44.3	4	90.0	48	2085	21.7	80	2
## 327 43.4	4	90.0	48	2335	23.7	80	2
## 328 36.4	5	121.0	67	2950	19.9	80	2
## 329 30.0	4	146.0	67	3250	21.8	80	2
## 330 44.6	4	91.0	67	1850	13.8	80	3
## 332 33.8	4	97.0	67	2145	18.0	80	3
## 333 29.8	4	89.0	62	1845	15.3	80	2
## 334 32.7	6	168.0	132	2910	11.4	80	3
## 335 23.7	3	70.0	100	2420	12.5	80	3
## 336 35.0	4	122.0	88	2500	15.1	80	2
## 338 32.4	4	107.0	72	2290	17.0	80	3
## 339 27.2	4	135.0	84	2490	15.7	81	1
## 340 26.6	4	151.0	84	2635	16.4	81	1
## 340 20.0 ## 341 25.8	4	156.0	92	2620	14.4	81	1
## 342 23.5	6	173.0	110	2725	12.6	81	1
## 343 30.0	4	135.0	84	2385	12.9	81	1
## 344 39.1	4	79.0	58	1755	16.9	81	3
## 345 39.0	4	86.0	64	1875	16.4	81	1
## 346 35.1	4	81.0	60	1760	16.1	81	3
## 347 32.3	4	97.0	67	2065	17.8	81	3
## 348 37.0	4	85.0	65	1975	19.4	81	3
## 349 37.7	4	89.0	62	2050	17.3	81	3
## 350 34.1	4	91.0	68	1985	16.0	81	3
## 351 34.7	4	105.0	63	2215	14.9	81	1
## 352 34.4	4	98.0	65	2045	16.2	81	1
## 353 29.9	4	98.0	65	2380	20.7	81	1
## 354 33.0	4	105.0	74	2190	14.2	81	2
## 356 33.7	4	107.0	75	2210	14.4	81	3
## 357 32.4	4	108.0	75	2350	16.8	81	3
## 358 32.9	4	119.0	100	2615	14.8	81	3
## 359 31.6	4	120.0	74	2635	18.3	81	3
## 360 28.1	4	141.0	80	3230	20.4	81	2
## 361 30.7	6	145.0	76	3160	19.6	81	2
## 362 25.4	6	168.0	116	2900	12.6	81	3
## 363 24.2	6	146.0	120	2930	13.8	81	3
## 364 22.4	6	231.0	110	3415	15.8	81	1
## 365 26.6	8	350.0	105	3725	19.0	81	1
## 366 20.2	6	200.0	88	3060	17.1	81	1
## 000 ZU.Z	J	200.0	00	3000	11.1	OI	1

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## 367 17.6
                                225.0
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                                                                     16.6
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## 368 28.0
                      4
                                 112.0
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                                                      2605
                                                                     19.6
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## 369 27.0
                      4
                                112.0
                                                88
                                                      2640
                                                                     18.6
                                                                             82
                                                                                      1
## 370 34.0
                      4
                                 112.0
                                                      2395
                                                88
                                                                     18.0
                                                                             82
                                                                                      1
## 371 31.0
                      4
                                112.0
                                                85
                                                      2575
                                                                     16.2
                                                                             82
                                                                                      1
## 372 29.0
                      4
                                135.0
                                                84
                                                      2525
                                                                     16.0
                                                                             82
                                                                                      1
## 373 27.0
                      4
                                                90
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                                                                     18.0
                                                                             82
                                                                                      1
                                151.0
## 374 24.0
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                                                92
                                                      2865
                                140.0
                                                                     16.4
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## 375 36.0
                      4
                                105.0
                                                74
                                                      1980
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## 376 37.0
                      4
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                                  91.0
                                                      2025
                                                                     18.2
## 377 31.0
                      4
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                                                                             82
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## 378 38.0
                      4
                                 105.0
                                                63
                                                      2125
                                                                     14.7
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                      4
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## 379 36.0
                                  98.0
                                                70
                                                      2125
                                                                     17.3
                                                                             82
                                                                                      3
## 380 36.0
                      4
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                                 120.0
                                                      2160
                                                                     14.5
## 381 36.0
                      4
                                 107.0
                                                75
                                                      2205
                                                                     14.5
                                                                             82
                                                                                      3
## 382 34.0
                      4
                                 108.0
                                                70
                                                      2245
                                                                     16.9
                                                                             82
                                                                                      3
## 383 38.0
                      4
                                                67
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                                  91.0
                                                                                      3
                      4
## 384 32.0
                                  91.0
                                                67
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                                                                             82
## 385 38.0
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                      6
## 386 25.0
                                 181.0
                                               110
                                                      2945
                                                                     16.4
                                                                             82
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## 387 38.0
                      6
                                262.0
                                                85
                                                      3015
                                                                     17.0
                                                                             82
                                                                                      1
## 388 26.0
                      4
                                 156.0
                                                92
                                                      2585
                                                                     14.5
                                                                             82
                                                                                      1
## 389 22.0
                      6
                                232.0
                                               112
                                                      2835
                                                                     14.7
                                                                             82
                                                                                      1
## 390 32.0
                      4
                                144.0
                                                96
                                                      2665
                                                                     13.9
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## 391 36.0
                      4
                                                84
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                                135.0
                                                      2370
                                                                     13.0
## 392 27.0
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                                151.0
                                                90
                                                      2950
                                                                     17.3
                                                                             82
                                                                                      1
## 393 27.0
                      4
                                140.0
                                                86
                                                      2790
                                                                     15.6
                                                                             82
                                                                                      1
   394 44.0
                      4
                                  97.0
                                                52
                                                                     24.6
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                                                                                      2
                                                      2130
## 395 32.0
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                                 135.0
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## 396 28.0
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                                                                                      1
## 397 31.0
                      4
                                 119.0
                                                82
                                                      2720
                                                                     19.4
                                                                             82
                                                                                      1
##
                                            name mpg01
## 1
                    chevrolet chevelle malibu
                                                      0
## 2
                                                      0
                             buick skylark 320
## 3
                            plymouth satellite
                                                      0
## 4
                                  amc rebel sst
                                                      0
## 5
                                    ford torino
                                                      0
## 6
                              ford galaxie 500
                                                      0
## 7
                              chevrolet impala
                                                      0
## 8
                                                      0
                             plymouth fury iii
## 9
                              pontiac catalina
                                                      0
## 10
                            amc ambassador dpl
                                                      0
## 11
                                                      0
                           dodge challenger se
## 12
                                                      0
                            plymouth 'cuda 340
## 13
                                                      0
                         chevrolet monte carlo
## 14
                      buick estate wagon (sw)
                                                      0
## 15
                         toyota corona mark ii
                                                      1
## 16
                                                      0
                               plymouth duster
## 17
                                     amc hornet
                                                      0
## 18
                                                      0
                                  ford maverick
## 19
                                                      1
                                   datsun pl510
## 20
                                                      1
                 volkswagen 1131 deluxe sedan
## 21
                                    peugeot 504
                                                      1
## 22
                                    audi 100 ls
```

## 23	saab 99e	1
## 24	bmw 2002	1
## 25	amc gremlin	0
## 26	ford f250	0
## 27	chevy c20	0
## 28	dodge d200	0
## 29	hi 1200d	0
## 30	datsun pl510	1
## 31	chevrolet vega 2300	1
## 32	toyota corona	1
## 34	amc gremlin	0
## 35	plymouth satellite custom	0
## 36	chevrolet chevelle malibu	0
## 37	ford torino 500	0
## 38	amc matador	0
## 39	chevrolet impala	0
## 40	pontiac catalina brougham	0
## 41	ford galaxie 500	0
## 42	plymouth fury iii	0
## 43	dodge monaco (sw)	0
## 44	ford country squire (sw)	0
## 45	pontiac safari (sw)	0
## 46	amc hornet sportabout (sw)	0
## 47	chevrolet vega (sw)	0
## 48	pontiac firebird	0
## 49	ford mustang	0
## 50	mercury capri 2000	1
## 51	opel 1900	1
## 52	peugeot 304	1
## 53	fiat 124b	1
## 54	toyota corolla 1200	1
## 55	datsun 1200	1
## 56	volkswagen model 111	1
## 57	plymouth cricket	1
## 58	toyota corona hardtop	1
## 59	dodge colt hardtop	1
## 60	volkswagen type 3	1
## 61	chevrolet vega	0
## 62	ford pinto runabout	0
## 63	chevrolet impala	0
## 64	pontiac catalina	0
## 65	plymouth fury iii	0
## 66	ford galaxie 500	0
## 67	amc ambassador sst	0
## 68	mercury marquis	0
## 69	buick lesabre custom	0
## 70	oldsmobile delta 88 royale	0
## 71	chrysler newport royal	0
## 72	mazda rx2 coupe	0
## 73	amc matador (sw)	0
## 74	chevrolet chevelle concours (sw)	0
## 75	ford gran torino (sw)	0
## 76	plymouth satellite custom (sw)	0
## 77	volvo 145e (sw)	0
		,

## 78	volkswagen 411 (sw)	0
## 79	peugeot 504 (sw)	0
## 80	renault 12 (sw)	1
## 81	ford pinto (sw)	0
## 82	datsun 510 (sw)	1
## 83	toyouta corona mark ii (sw)	1
## 84	dodge colt (sw)	1
## 85	toyota corolla 1600 (sw)	1
## 86	buick century 350	0
## 87	amc matador	0
## 88	chevrolet malibu	0
## 89	ford gran torino	0
## 90	dodge coronet custom	0
## 91	mercury marquis brougham	0
## 92	chevrolet caprice classic	0
## 93	ford ltd	0
## 94	plymouth fury gran sedan	0
## 95	chrysler new yorker brougham	0
## 96	buick electra 225 custom	0
## 97	amc ambassador brougham	0
## 98	plymouth valiant	0
## 99	chevrolet nova custom	0
## 100	amc hornet	0
## 101	ford maverick	0
## 102	plymouth duster	1
## 103	volkswagen super beetle	1
## 104	chevrolet impala	0
## 105	ford country	0
## 106	plymouth custom suburb	0
## 107	oldsmobile vista cruiser	0
## 108	amc gremlin	0
## 109	toyota carina	0
## 110	chevrolet vega	0
## 111	datsun 610	0
## 112	maxda rx3	0
## 113	ford pinto	0
## 114	mercury capri v6	0
## 115	fiat 124 sport coupe	1
## 116	chevrolet monte carlo s	0
## 117	pontiac grand prix	0
## 118	fiat 128	1
## 119	opel manta	1
## 120	audi 1001s	0
## 121	volvo 144ea	0
## 122	dodge dart custom	0
## 123	saab 991e	1
## 124	toyota mark ii	0
## 125	oldsmobile omega	0
## 126	plymouth duster	0
## 128	amc hornet	0
## 129	chevrolet nova	0
## 130	datsun b210	1
## 131	ford pinto	1
## 131	toyota corolla 1200	1
## 132	toyota cororra 1200	1

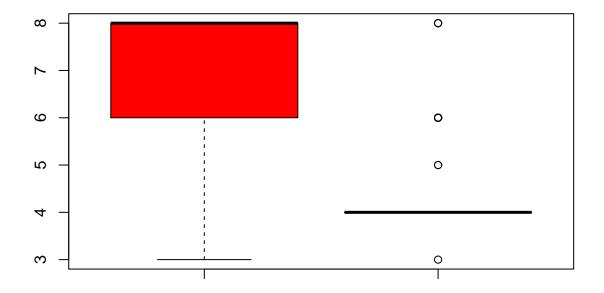
## 133	chevrolet vega	1
## 134	chevrolet chevelle malibu classic	0
## 135	amc matador	0
## 136	plymouth satellite sebring	0
## 137	ford gran torino	0
## 138	buick century luxus (sw)	0
## 139	dodge coronet custom (sw)	0
## 140	ford gran torino (sw)	0
## 141	amc matador (sw)	0
## 142	audi fox	1
## 143	volkswagen dasher	1
## 144	opel manta	1
## 145	toyota corona	1
## 146	datsun 710	1
## 147	dodge colt	1
## 148	fiat 128	1
## 149	fiat 124 tc	1
## 150	honda civic	1
## 151	subaru	1
## 152	fiat x1.9	1
## 153	plymouth valiant custom	0
## 154	chevrolet nova	0
## 155	mercury monarch	0
## 156	ford maverick	0
## 157	pontiac catalina	0
## 158	chevrolet bel air	0
## 159	plymouth grand fury	0
## 160	ford ltd	0
## 161	buick century	0
## 162	chevroelt chevelle malibu	0
## 163	amc matador	0
## 164	plymouth fury	0
## 165	buick skyhawk	0
## 166	chevrolet monza 2+2	0
## 167	ford mustang ii	0
## 168	toyota corolla	1
## 169	ford pinto	1
## 170	amc gremlin	0
## 171	pontiac astro	1
## 172	toyota corona	1
## 173	volkswagen dasher	1
## 174	datsun 710	1
## 175	ford pinto	0
## 176	volkswagen rabbit	1
## 177	amc pacer	0
## 178	audi 100ls	1
## 179	peugeot 504	1
## 180	volvo 244dl	0
## 181	saab 991e	1
## 182	honda civic cvcc	1
## 183	fiat 131	1
## 184	opel 1900	1
## 185	capri ii	1
## 186	dodge colt	1
	, , , , , , , , , , , , , , , , , , , ,	

## 187	renault 12tl	1
## 188	chevrolet chevelle malibu classic	0
## 189	dodge coronet brougham	0
## 190	amc matador	0
## 191	ford gran torino	0
## 192	plymouth valiant	0
## 193	chevrolet nova	0
## 194	ford maverick	1
## 195	amc hornet	0
## 196	chevrolet chevette	1
## 197	chevrolet woody	1
## 198	vw rabbit	1
## 199	honda civic	1
## 200	dodge aspen se	0
## 201	ford granada ghia	0
## 202	pontiac ventura sj	0
## 203	amc pacer d/l	0
## 204	volkswagen rabbit	1
## 205	datsun b-210	1
## 206	toyota corolla	1
## 207	ford pinto	1
## 208	volvo 245	0
## 209	plymouth volare premier v8	0
## 210	peugeot 504	0
## 211	toyota mark ii	0
## 212	mercedes-benz 280s	0
## 213	cadillac seville	0
## 214	chevy c10	0
## 215	ford f108	0
## 216	dodge d100	0
## 217	honda accord cvcc	1
## 218	buick opel isuzu deluxe	1
## 219	renault 5 gtl	1
## 220	plymouth arrow gs	1
## 221	datsun f-10 hatchback	1
## 222	chevrolet caprice classic	0
## 223	oldsmobile cutlass supreme	0
## 224	dodge monaco brougham	0
## 225	mercury cougar brougham	0
## 226	chevrolet concours	0
## 227	buick skylark	0
## 228	plymouth volare custom	0
## 229	ford granada	0
## 230	pontiac grand prix lj	0
## 231	chevrolet monte carlo landau	0
## 232	chrysler cordoba	0
## 233	ford thunderbird	0
## 234	volkswagen rabbit custom	1
## 235	pontiac sunbird coupe	1
## 236	toyota corolla liftback	1
## 237	ford mustang ii 2+2	1
## 238	chevrolet chevette	1
## 239	dodge colt m/m	1
## 240	subaru dl	1

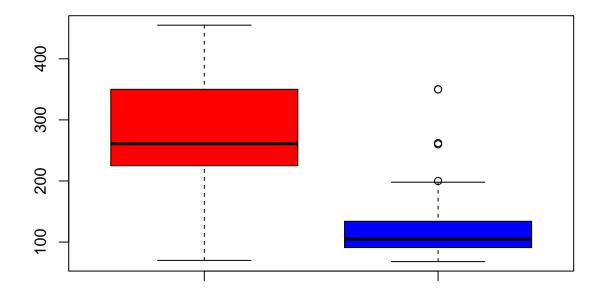
```
## 241
                           volkswagen dasher
                                                   1
## 242
                                   datsun 810
                                                   0
## 243
                                     bmw 320i
                                                   0
## 244
                                   mazda rx-4
                                                   0
## 245
            volkswagen rabbit custom diesel
                                                   1
## 246
                                                   1
                                  ford fiesta
## 247
                            mazda glc deluxe
                                                   1
## 248
                               datsun b210 gx
                                                   1
## 249
                            honda civic cvcc
                                                   1
## 250
          oldsmobile cutlass salon brougham
                                                   0
## 251
                              dodge diplomat
                                                   0
## 252
                                                   0
                        mercury monarch ghia
## 253
                                                   0
                          pontiac phoenix lj
                                                   0
## 254
                            chevrolet malibu
## 255
                        ford fairmont (auto)
                                                   0
## 256
                         ford fairmont (man)
                                                   1
## 257
                                                   0
                              plymouth volare
## 258
                                  amc concord
                                                   0
## 259
                       buick century special
                                                   0
## 260
                              mercury zephyr
                                                   0
## 261
                                  dodge aspen
                                                   0
## 262
                              amc concord d/l
                                                   0
## 263
                chevrolet monte carlo landau
                                                   0
## 264
            buick regal sport coupe (turbo)
## 265
                                                   0
                                  ford futura
## 266
                              dodge magnum xe
                                                   0
## 267
                          chevrolet chevette
                                                   1
## 268
                                                   1
                                toyota corona
                                                   1
## 269
                                   datsun 510
## 270
                                                   1
                                   dodge omni
## 271
                   toyota celica gt liftback
                                                   0
## 272
                            plymouth sapporo
                                                   1
## 273
                                                   1
                      oldsmobile starfire sx
## 274
                                datsun 200-sx
                                                   1
## 275
                                                   0
                                    audi 5000
## 276
                                  volvo 264gl
                                                   0
## 277
                                   saab 99gle
                                                   0
## 278
                                peugeot 604sl
                                                   0
## 279
                         volkswagen scirocco
## 280
                             honda accord lx
                                                   1
## 281
                           pontiac lemans v6
## 282
                            mercury zephyr 6
                                                   0
## 283
                              ford fairmont 4
                                                   0
                                                   0
## 284
                            amc concord dl 6
## 285
                                dodge aspen 6
## 286
                                                   0
                   chevrolet caprice classic
## 287
                                                   0
                              ford 1td landau
## 288
                       mercury grand marquis
                                                   0
## 289
                              dodge st. regis
                                                   0
                                                   0
## 290
                     buick estate wagon (sw)
## 291
                    ford country squire (sw)
                                                   0
               chevrolet malibu classic (sw)
                                                   0
## 292
## 293 chrysler lebaron town @ country (sw)
                                                   0
## 294
                            vw rabbit custom
```

## 295	maxda glc deluxe	1
## 296	dodge colt hatchback custom	1
## 297	amc spirit dl	1
## 298	mercedes benz 300d	1
## 299	cadillac eldorado	1
## 300	peugeot 504	1
## 301	oldsmobile cutlass salon brougham	1
## 302	plymouth horizon	1
## 303	plymouth horizon tc3	1
## 304	datsun 210	1
## 305	fiat strada custom	1
## 306	buick skylark limited	1
## 307	chevrolet citation	1
## 308	oldsmobile omega brougham	1
## 309	pontiac phoenix	1
## 310	vw rabbit	1
## 311	toyota corolla tercel	1
## 312	chevrolet chevette	1
## 313	datsun 310	1
## 314	chevrolet citation	1
## 315	ford fairmont	1
## 316	amc concord	1
## 317	dodge aspen	0
## 318	audi 4000	1
## 319	toyota corona liftback	1
## 320	mazda 626	1
## 321	datsun 510 hatchback	1
## 322	toyota corolla	1
## 323	mazda glc	1
## 324	dodge colt	1
## 324	datsun 210	1
## 325	vw rabbit c (diesel)	1
## 320	vw labbit c (diesel) vw dasher (diesel)	1
	audi 5000s (diesel)	1
## 329	mercedes-benz 240d	1
## 330	honda civic 1500 gl	1
## 332	subaru dl	1
## 333	vokswagen rabbit	1
## 334	datsun 280-zx	1
## 335	mazda rx-7 gs	1
## 336	triumph tr7 coupe	1
## 338	honda accord	1
## 339	plymouth reliant	1
## 340	buick skylark	1
## 341	dodge aries wagon (sw)	1
## 342	chevrolet citation	1
## 343	plymouth reliant	1
## 344	toyota starlet	1
## 345	plymouth champ	1
## 346	honda civic 1300	1
## 347	subaru	1
## 348	datsun 210 mpg	1
## 349	toyota tercel	1
## 350	mazda glc 4	1

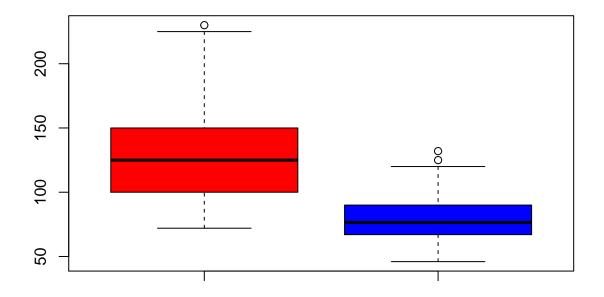
```
## 351
                          plymouth horizon 4
## 352
                              ford escort 4w
## 353
                              ford escort 2h
## 354
                            volkswagen jetta
                                                  1
## 356
                               honda prelude
                                                  1
## 357
                              toyota corolla
                                                  1
## 358
                                datsun 200sx
## 359
                                    mazda 626
                                                  1
## 360
                  peugeot 505s turbo diesel
## 361
                                                  1
                                volvo diesel
## 362
                             toyota cressida
                                                  1
## 363
                           datsun 810 maxima
                                                  1
## 364
                                                  0
                               buick century
## 365
                       oldsmobile cutlass ls
## 366
                             ford granada gl
                                                  0
## 367
                      chrysler lebaron salon
                                                  0
## 368
                          chevrolet cavalier
                                                  1
## 369
                    chevrolet cavalier wagon
## 370
                   chevrolet cavalier 2-door
                                                  1
## 371
                  pontiac j2000 se hatchback
## 372
                              dodge aries se
                                                  1
## 373
                             pontiac phoenix
## 374
                        ford fairmont futura
                                                  1
## 375
                         volkswagen rabbit l
## 376
                          mazda glc custom 1
## 377
                            mazda glc custom
## 378
                      plymouth horizon miser
                                                  1
## 379
                                                  1
                              mercury lynx 1
## 380
                                                  1
                            nissan stanza xe
## 381
                                                  1
                                honda accord
## 382
                              toyota corolla
                                                  1
## 383
                                 honda civic
                                                  1
## 384
                          honda civic (auto)
## 385
                               datsun 310 gx
                                                  1
## 386
                       buick century limited
## 387
          oldsmobile cutlass ciera (diesel)
                                                  1
## 388
                  chrysler lebaron medallion
## 389
                              ford granada 1
                                                  0
## 390
                            toyota celica gt
## 391
                           dodge charger 2.2
## 392
                            chevrolet camaro
## 393
                             ford mustang gl
                                                  1
## 394
                                   vw pickup
                                                  1
## 395
                               dodge rampage
## 396
                                 ford ranger
                                                  1
## 397
                                  chevy s-10
                                                  1
for (i in 2:8) {
  boxplot(Auto[Auto$mpg01==0,i], Auto[Auto$mpg01==1,i],col=c('red','blue'),xlab='mpg 0 mpg 1')
}
```



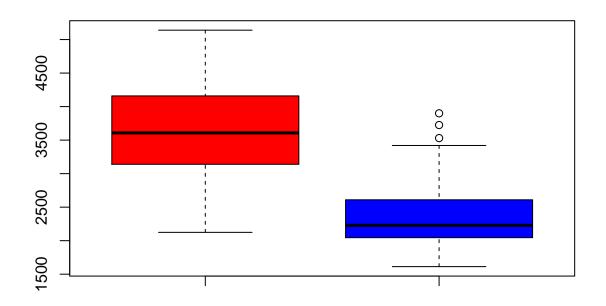
mpg 0 mpg 1



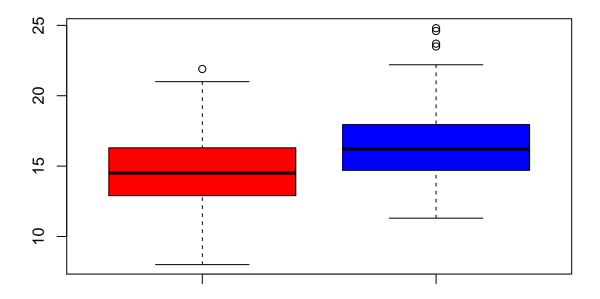
mpg 0 mpg 1



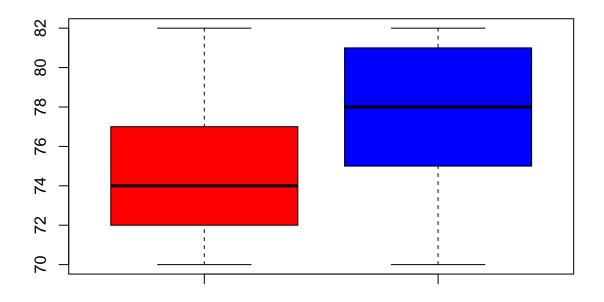
mpg 0 mpg 1



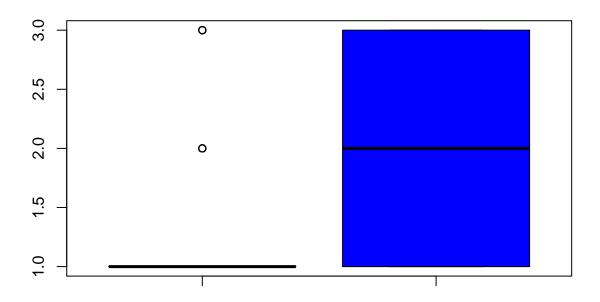
mpg 0 mpg 1



mpg 0 mpg 1

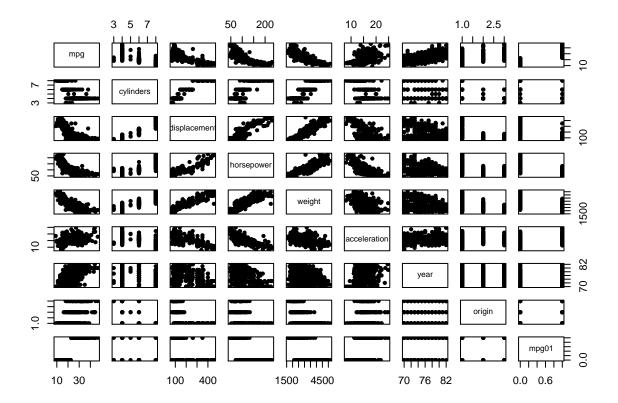


mpg 0 mpg 1



mpg 0 mpg 1

```
Auto_scat = as.matrix(Auto[,-9])
pairs(Auto_scat,pch = 20)
```



We determined that cylinders, displacement, horsepower, weight, and year would be the most useful in predicting mpg01. Acceleration was too similar to use and origin was not indicative at all.

```
train_size = 300
test_size = 92
n = dim(Auto)[1]
train_ind = sample(1:n, train_size, replace=FALSE)
test_ind = (1:n)[-train_ind]
Auto_train = Auto[train_ind,]
Auto_test = Auto[test_ind,]
mpg1_TR = Auto_train[Auto_train$mpg01 == "1",c(2,3,4,5,7)]
mpg0_TR = Auto_train[Auto_train$mpg01 == "0",c(2,3,4,5,7)]
n1_TR = dim(mpg1_TR)[1]
nO_TR = dim(mpgO_TR)[1]
N_TR = n1_TR + n0_TR
N_TR
## [1] 300
mpg1_p = n1_TR/N_TR
mpg0_p = n0_TR/N_TR
mpg1_mu = colMeans(mpg1_TR)
mpg0_mu = colMeans(mpg0_TR)
rbind(mpg1_mu,mpg0_mu)
```

```
cylinders displacement horsepower
                                               weight
## mpg1_mu 4.149660
                         114.5748
                                    78.58503 2320.755 77.53061
## mpg0 mu 6.816993
                         275.4052 131.20915 3635.314 74.43137
mpg1_S = cov(mpg1_TR)
mpg0_S = cov(mpg0_TR)
S_{pool} = ((n1_TR-1)*mpg1_S + (n0_TR-1)*mpg0_S)/(n1_TR + n0_TR - 1)
S_pool
##
                  cylinders displacement horsepower
                                                           weight
                                                                         year
## cylinders
                 1.1892418
                                66.78495
                                            22.11701
                                                        453.68954 -0.1558362
## displacement 66.7849503
                              4736.87476 1604.89497 31710.09279 -19.6524476
## horsepower
                 22.1170082
                             1604.89497
                                           831.52172 11718.48837 -20.0616608
                453.6895387 31710.09279 11718.48837 304401.67935 21.0414587
## weight
                 -0.1558362
                                           -20.06166
## year
                               -19.65245
                                                         21.04146 11.1576644
S_inv = solve(S_pool)
mpg1\_alpha = -0.5*t(mpg1\_mu) %*% S_inv %*% mpg1\_mu + log(mpg1\_p)
mpg0_alpha = -0.5*t(mpg0_mu) %*% S_inv %*% mpg0_mu + log(mpg0_p)
mpg01_alpha = c(mpg1_alpha,mpg0_alpha)
mpg01_alpha
## [1] -317.0845 -307.9987
mpg1_beta = S_inv %*% mpg1_mu
mpg0 beta = S inv %*% mpg0 mu
mpg01_beta = cbind(mpg1_beta,mpg0_beta)
mpg01_beta
##
                                     [,2]
                        [,1]
                7.610835856 9.231858269
## cylinders
## displacement -0.213587756 -0.215906733
## horsepower
                0.511437650 0.481771086
## weight
                -0.001683751 0.001624404
## year
                7.601487939 7.282696475
prediction = c()
mpg1_dvec = c()
mpg0_dvec = c()
label = c("1","0")
for(i in 1:nrow(Auto_test)){
  x = t(Auto test[i,c(2,3,4,5,7)])
  mpg1_d = mpg1_alpha + t(mpg1_beta) %*% x
  mpg0_d = mpg0_alpha + t(mpg0_beta) %*% x
  dvec = c(mpg1_d, mpg0_d)
  prediction = append(prediction, label[which.max(dvec)])
  mpg1_dvec = append(mpg1_dvec,mpg1_d)
  mpg0_dvec = append(mpg0_dvec,mpg0_d)
}
Auto_test$prediction = prediction
```

##		mpg	cylinders	displacement	horsepower	weight	acceleration	year	origin
##	5	17.0	8	302	140	3449	10.5	70	1
##	7	14.0	8	454	220	4354	9.0	70	1
##	10	15.0	8	390	190	3850	8.5	70	1
##	16	22.0	6	198	95	2833	15.5	70	1
##	22	24.0	4	107	90	2430	14.5	70	2
##	37	19.0	6	250	88	3302	15.5	71	1
##	45	13.0	8	400	175	5140	12.0	71	1
##	46	18.0	6	258	110	2962	13.5	71	1
##	48	19.0	6	250	100	3282	15.0	71	1
##	52	30.0	4	79	70	2074	19.5	71	2
##	53	30.0	4	88	76	2065	14.5	71	2
##	55	35.0	4	72	69	1613	18.0	71	3
##	57	26.0	4	91	70	1955	20.5	71	1
##	61	20.0	4	140	90	2408	19.5	72	1
##	66	14.0	8	351	153	4129	13.0	72	1
##	67	17.0	8	304	150	3672	11.5	72	1
##	68	11.0	8	429	208	4633	11.0	72	1
##	72	19.0	3	70	97	2330	13.5	72	3
##	80	26.0	4	96	69	2189	18.0	72	2
##	81	22.0	4	122	86	2395	16.0	72	1
##	90	15.0	8	318	150	3777	12.5	73	1
##	91	12.0	8	429	198	4952	11.5	73	1
##	94	14.0	8	318	150	4237	14.5	73	1
##	106	13.0	8	360	170	4654	13.0	73	1
##	108	18.0	6	232	100	2789	15.0	73	1
##	111	22.0	4	108	94	2379	16.5	73	3
##		26.0	4	98	90	2265	15.5	73	2
##		15.0	8	350	145	4082	13.0	73	1
##		24.0	4	116	75	2158	15.5	73	2
##		15.0	8	318	150	3399	11.0	73	1
##		29.0	4	98	83	2219	16.5	74	2
##		28.0	4	90	75	2125	14.5	74	1
##		26.0	4	108	93	2391	15.5	74	3
##		31.0	4	79	67	2000	16.0	74	2
##		18.0	6	250	105	3459	16.0	75	1
##		15.0	6	250	72	3432	21.0	75	1
		14.0	8	351	148	4657	13.5	75	1
##		17.0	6	231	110	3907	21.0	75	1
##		18.0	6	225	95	3785	19.0	75	1
##		21.0	6	231	110	3039	15.0	75 75	1
##		24.0	4	134	96	2702	13.5	75 75	3
		19.0	6	232	90	3211	17.0	75 76	1
##		17.5	8	305	140	4215	13.0	76	1
		22.0	6	225	100	3233	15.4	76	1
		24.0	6	200	81	3012	17.6	76	1
		16.5	8	350	180	4380	12.1	76	1
		36.0	4	79	58	1825	18.6	77 77	2
		25.5	4	122	96 70	2300	15.5	77 77	1
		33.5	4	85	70 110	1945	16.8	77 77	3
##	ZZ 3	17.0	8	260	110	4060	19.0	77	1

			_							
		17.5	6	250	110	3520		16.4	77	1
		19.0	6	225	100	3630		17.7	77	1
		24.5	4	151	88	2740		16.0	77	1
		25.5	4	140	89	2755		15.8	77	1
		21.5	4	121	110	2600		12.8	77	2
##	245	43.1	4	90	48	1985		21.5	78	2
##	246	36.1	4	98	66	1800		14.4	78	1
##	247	32.8	4	78	52	1985		19.4	78	3
##	256	25.1	4	140	88	2720		15.4	78	1
##	260	20.8	6	200	85	3070		16.7	78	1
##	261	18.6	6	225	110	3620		18.7	78	1
##	268	27.5	4	134	95	2560		14.2	78	3
##	273	23.8	4	151	85	2855		17.6	78	1
##	278	16.2	6	163	133	3410		15.8	78	2
##	279	31.5	4	89	71	1990		14.9	78	2
##	280	29.5	4	98	68	2135		16.6	78	3
##	283	22.3	4	140	88	2890		17.3	79	1
##	289	18.2	8	318	135	3830		15.2	79	1
##	292	19.2	8	267	125	3605		15.0	79	1
##	297	27.4	4	121	80	2670		15.0	79	1
##	301	23.9	8	260	90	3420		22.2	79	1
##	308	26.8	6	173	115	2700		12.9	79	1
##	316	24.3	4	151	90	3003		20.1	80	1
		31.3	4	120	75	2542		17.5	80	3
##	325	40.8	4	85	65	2110		19.2	80	3
##	326	44.3	4	90	48	2085		21.7	80	2
		43.4	4	90	48	2335		23.7	80	2
		32.7	6	168	132	2910		11.4	80	3
		23.7	3	70	100	2420		12.5	80	3
		27.2	4	135	84	2490		15.7	81	1
		25.8	4	156	92	2620		14.4	81	1
		33.0	4	105	74	2190		14.2	81	2
		24.2	6	146	120	2930		13.8	81	3
		27.0	4	112	88	2640		18.6	82	1
		36.0	4	98	70	2125		17.3	82	1
		32.0	4	91	67	1965		15.7	82	3
		38.0	4	91	67	1995		16.2	82	3
		38.0	6	262	85	3015		17.0	82	1
		26.0	4	156	92	2585		14.5	82	1
		22.0	6	232	112	2835		14.7	82	1
		27.0	4	140	86	2790		15.6	82	1
		44.0	4	97	52	2130		24.6	82	2
##			_			prediction				_
##	5			ford torino	0	Prodress	0			
	7		che	vrolet impala	0		0			
	10			mbassador dpl	0		0			
	16			ymouth duster	0		0			
	22		Ρ	audi 100 ls	1		1			
	37		fo	rd torino 500	0		0			
##				c safari (sw)	0		0			
##			amc hornet sp		0		0			
	48		_	tiac firebird	0		0			
	52		pon	peugeot 304	1		1			
	53			fiat 124b	1		1			
ππ	55			1146 1240	1		-			

##	55	datsun 1200	1	1
##	57	plymouth cricket	1	1
##	61	chevrolet vega	0	1
##	66	ford galaxie 500	0	0
##	67	amc ambassador sst	0	0
##	68	mercury marquis	0	0
##	72	mazda rx2 coupe	0	1
##	80	renault 12 (sw)	1	1
##	81	ford pinto (sw)	0	1
##	90	dodge coronet custom	0	0
##	91	mercury marquis brougham	0	0
##	94	plymouth fury gran sedan	0	0
##	106	plymouth custom suburb	0	0
##	108	amc gremlin	0	0
##	111	datsun 610	0	1
##	115	fiat 124 sport coupe	1	1
##	116	chevrolet monte carlo s	0	0
##	119	opel manta	1	1
##	122	dodge dart custom	0	0
##	142	audi fox	1	1
##	147	dodge colt	1	1
##	151	subaru	1	1
##	152	fiat x1.9	1	1
##	154	chevrolet nova	0	0
##	155		0	0
##	160	mercury monarch ford ltd		
##	161		0	0
	164	buick century	0	0
##		plymouth fury	0	0
##	165	buick skyhawk	0	0
##	172	toyota corona	1	1
##	177	amc pacer	0	0
##	188	chevrolet chevelle malibu classic	0	0
##	192	plymouth valiant	0	0
##	194	ford maverick	1	0
##	213	cadillac seville	0	0
##	219	renault 5 gtl	1	1
##	220	plymouth arrow gs	1	1
##	221	datsun f-10 hatchback	1	1
##	223	oldsmobile cutlass supreme	0	0
##	226	chevrolet concours	0	0
##	228	plymouth volare custom	0	0
##	235	pontiac sunbird coupe	1	1
##	237	ford mustang ii 2+2	1	1
##	243	bmw 320i	0	1
##	245	volkswagen rabbit custom diesel	1	1
##	246	ford fiesta	1	1
##	247	mazda glc deluxe	1	1
##	256	ford fairmont (man)	1	1
##	260	mercury zephyr	0	0
##	261	dodge aspen	0	0
##	268	toyota corona	1	1
##	273	oldsmobile starfire sx	1	1
##	278	peugeot 604sl	0	0
##	279	volkswagen scirocco	1	1
		=		

```
## 283
                         ford fairmont 4
                                              0
## 289
                         dodge st. regis
                                                          0
## 292
           chevrolet malibu classic (sw)
                                              0
                                                         0
## 297
                           amc spirit dl
                                              1
                                                         1
## 301 oldsmobile cutlass salon brougham
                                              1
                                                          0
## 308
               oldsmobile omega brougham
## 316
                              amc concord
                                              1
                                                         1
## 320
                                mazda 626
## 325
                               datsun 210
                                              1
                                                         1
## 326
                   vw rabbit c (diesel)
                                                         1
## 327
                      vw dasher (diesel)
                                              1
                                                          1
## 334
                           datsun 280-zx
                                              1
                                                         1
## 335
                           mazda rx-7 gs
                                              1
                                                          1
## 339
                        plymouth reliant
                                              1
                                                          1
## 341
                  dodge aries wagon (sw)
                                              1
                                                          1
## 354
                        volkswagen jetta
                                              1
                                                          1
## 363
                       datsun 810 maxima
                                              1
## 369
               chevrolet cavalier wagon
                                              1
                                                          1
## 379
                          mercury lynx l
                                              1
                                                          1
## 384
                      honda civic (auto)
                                              1
                                                         1
## 385
                           datsun 310 gx
## 387 oldsmobile cutlass ciera (diesel)
                                              1
                                                          1
## 388
              chrysler lebaron medallion
## 389
                                              0
                                                         1
                          ford granada 1
## 393
                         ford mustang gl
                                                         1
## 394
                                vw pickup
                                              1
                                                          1
Correct1 = 0
Incorrect1 = 0
Correct0 = 0
Incorrect0 = 0
for(i in 1:92){
  if(Auto_test[i,10] == 1){
    if(Auto_test[i,10] == Auto_test[i,11]){
      Correct1 = Correct1 + 1
    }
    if(Auto_test[i,10] != Auto_test[i,11]){
      Incorrect1 = Incorrect1 + 1
    }
  if(Auto_test[i,10] == 0){
    if(Auto_test[i,10] == Auto_test[i,11]){
      Correct0 = Correct0 + 1
    }
    if(Auto_test[i,10] != Auto_test[i,11]){
      Incorrect0 = Incorrect0 + 1
    }
 }
```

honda accord lx

280

```
Table1 = rbind(Correct1 + Incorrect1,Correct1,Incorrect1)
Table0 = rbind(Correct0 + Incorrect0,Correct0,Incorrect0)
Table_full = cbind(Table1,Table0)

colnames(Table_full) = c("mpg1","mpg0")
rownames(Table_full) = c("Number of Observations","Correct","Incorrect")
Table_full
```

```
## Number of Observations 49 43 43 44 Incorrect 2 7
```

Results and Conclusions

We used horsepower, weight, number of cylinders, displacement, and acceleration to predict if the mpg for the automobile is higher or lower than the median. Using these variables we constructed linear discrimination functions used to predict the mpg01 of the automobile. Out of the 90 test samples, we correctly predicted 81 of the samples which is a 88.04% accuracy rate. 40 of the samples were correctly predicted to have a mpg greater than or equal to the median and 41 of the samples were correctly predicted to have a mpg less than the median. We incorrectly predicted 8 sample had lower mpg than the median when it actually had a higher mpg. We also incorrectly predicted 3 samples had higher mpg than the median when they actually had a lower mpg.