# **Section 1: Questions 1-5**

Download the Auto data set, from the course Blackboard page to answer questions 1 - 5.

1. Which of the predictors are quantitative, and which are qualitative? [Hint: Use the codes: Auto <- read.csv("Auto.csv", na.strings="?"), summary(Auto)]

# Quantitative predictors:

- mpg
- cylinders
- displacement
- horsepower
- weight
- acceleration
- year
- origin

## Qualitative predictors:

name

#### Note:

- "origin" is essentially a qualitative predictor that has been coded as a numeric value.
- 2. What is the range and median of each quantitative predictor? [Hint: Use the codes: require(psych), describe(Auto)]

	Variable	Min	Max	Median
1	mpg	9	46.6	23
2	cylinders	3	8	4
3	displacement	68	455	146
4	horsepower	46	230	93.5
5	weight	1613	5140	2800
6	acceleration	8	24.8	15.5
7	year	70	82	76
8	origin	1	3	1

3. What is the mean and standard deviation of each quantitative predictor?

variable	Mean	Sta
1 mpg	23.5158690176322	7.82580392894656
2 cylinders	5.45843828715365	1.70157698079185
3 displacement	193.53274559194	104.37958329993

4	horsepower	104.469387755102	38.4911599328285
5	weight	2970.26196473552	847.904119489725
6	acceleration	15.5556675062972	2.74999529297615
7	year	75.9949622166247	3.69000490146168
8	origin	1.57430730478589	0.802549495797039

4. Remove the 25th through 115th observations. What is the range, median, mean, and standard deviation of each predictor in the subset of the data that remains?

	Variable	Min	Max	Median	Mean	Std
1	mpg	11	46.6	24.4	25.0483660130719	7.67368169550678
2	cylinders	3	8	4	5.27124183006536	1.60989453692315
3	displacement	68	455	140	180.37908496732	95.9156396099349
4	horsepower	46	230	90	98.7880794701987	34.402466355131
5	weight	1649	4699	2722.5	2867.70261437908	755.640837439492
6	acceleration	8	24.8	15.65	15.738888888889	2.74549241438579
7	year	70	82	77.5	77.2091503267974	3.31247734496922
8	origin	1	3	1	1.63071895424837	0.820378245089793

5. Suppose that we wish to predict gas mileage (mpg) on the basis of other variables. Using the full data set which variables do you believe will be useful in predicting mpg? Explain your answer using plots and correlation coefficients of the data.

The order of usefulness of predicting "mpg" is:

- 1. weight
- 2. year
- 3. origin
- 4. displacement
- 5. horsepower
- 6. cylinders
- 7. acceleration

This is based on the forward selection stepwise process. By definition, the most predictive variable is added into the model with each iteration, thus this order is indicative of the predictive value.

However, generating the full linear model and checking variable significance, we see that only the following variables have a significant relationship with "mpg":

- displacement
- weight
- year
- origin

# Call:

 $Im(formula = mpg \sim ., data = Auto3)$ 

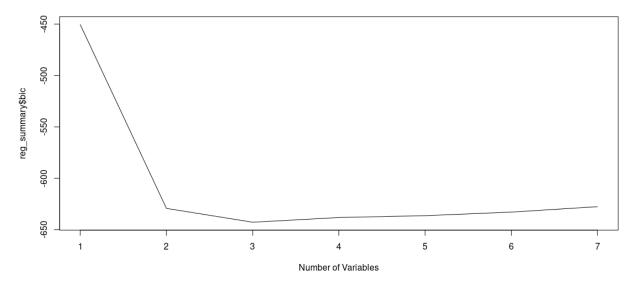
## Residuals:

Min 1Q Median 3Q Max -9.5903 -2.1565 -0.1169 1.8690 13.0604

## Coefficients:

Estimate	Std. Error	t value	Pr(> t )
-17.218435	4.644294	-3.707	0.00024 ***
-0.493376	0.323282	-1.526	0.12780
0.019896	0.007515	2.647	0.00844 **
-0.016951	0.013787	-1.230	0.21963
-0.006474	0.000652	-9.929	< 2e-16 ***
0.080576	0.098845	0.815	0.41548
0.750773	0.050973	14.729	< 2e-16 ***
1.426141	0.278136	5.127	4.67e-07 ***
	-17.218435 -0.493376 0.019896 -0.016951 -0.006474 0.080576 0.750773	-17.218435	-17.218435 4.644294 -3.707   -0.493376 0.323282 -1.526   0.019896 0.007515 2.647   -0.016951 0.013787 -1.230   -0.006474 0.000652 -9.929   0.080576 0.098845 0.815   0.750773 0.050973 14.729

Finally, examining the marginal value gained from each additional predictor, we generate the plot:



This indicates that the best (most generalizable) model, likely only uses two or three predictors, specifically:

- weight
- year
- origin

# **Section 2: Questions 6-8**

GPA's (Grade Point Averages) for 16 graduating MBA students, and their GMAT scores taken before entering the MBA program are given below. Use this data to respond to questions 6-8.

6. Create a linear regression model that uses GMAT scores as a predictor of GPA. Obtain and interpret the coefficient of determination  $R^2$ .

The R^2 value for the model is 0.0818, indicating that the model explains approximately 8% of the variance observed within gpa. It is worth being skeptical of any conclusions based on this observation, since the model does not show a significant relationship between GPA and GMAT.

#### Call:

 $Im(formula = gpa \sim gmat, data = data6)$ 

### Residuals:

Min 1Q Median 3Q Max -1.07025 -0.21217 0.04427 0.35855 0.54359

#### Coefficients:

	Estimate	Std. Error	t value	Pr(> t )
(Intercept)	1.571451	1.588509	0.989	0.339
gmat	0.003048	0.002729	1.117	0.283

Residual standard error: 0.4707 on 14 degrees of freedom Multiple R-squared: 0.0818, Adjusted R-squared: 0.01622

F-statistic: 1.247 on 1 and 14 DF, p-value: 0.2829

7. Calculate the fitted value for the fourth student on the list (GMAT = 580).

The predicted GPA for a student with a GMAT score of 580 is 3.339291.

8. Test whether GMAT is an important variable using a significance level of 0.05.

GMAT is not significant at the level of 0.05, as seen from the results of the model summary (shown in Q6).

# **Section 3: Questions 9-10**

Use the rnorm() function to create a vector of 150 observations drawn from a N(0,1) distribution (call this vector x), and another vector of 150 observations drawn from a N(0, 0.2) distribution (call this vector Error). Use these to create a vector y according to the model Y = -1.5 + 0.8 X + Error. Consider this data to answer questions 9 and 10.

9. Fit a least squares linear model to predict y using x. How do  $\hat{\beta}_0$  and  $\hat{\beta}_1$  compare to the actual values of  $\beta_0$  and  $\beta_1$ ?

The estimated value for B0\_hat is -1.48. The estimated value for B1\_hat is 0.81. These values are very close approximations to the true values of -1.5 and 0.8.

#### Call:

 $Im(formula = y \sim x)$ 

### Residuals:

Min 1Q Median 3Q Max -0.60818 -0.13057 -0.02169 0.13646 0.53198

#### Coefficients:

	Estimate	Std. Error	t value	Pr(> t )
(Intercept)	-1.48218	0.01691	-87.67	<2e-16 ***
X	0.81574	0.01891	43.13	<2e-16 ***

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Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.2067 on 148 degrees of freedom Multiple R-squared: 0.9263, Adjusted R-squared: 0.9258 F-statistic: 1860 on 1 and 148 DF, p-value: < 2.2e-16

10. What are the 95% confidence intervals for  $\hat{\beta}_0$  and  $\hat{\beta}_1$  and what is the prediction interval for a case with x = 1?

The confidence intervals for B0\_hat and B1\_hat are:

> confint(lm9)

2.5 % 97.5 % (Intercept) -1.5155923 -1.4487730 x 0.7783667 0.8531157

The prediction interval for an observation of x=1 is:

> predict(Im9, data.frame(x=1), interval="prediction")

fit lwr upr

1 -0.6664415 -1.078096 -0.2547867