# PSTAT126 Lab4

# R Markdown

https://rmarkdown.rstudio.com/index.html

# Chap 3: Multiple Linear Regression

## Model

$$\begin{split} E[Y|X] &= \beta_0 + \beta_1 X_1 + \ldots + \beta_p X_p, \, Var(Y|X) = \sigma^2; \\ \text{Unknown Parameters: } \beta \mathbf{s}, \, \sigma^2; \end{split}$$

# **Matrix Notation**

$$Y = \begin{pmatrix} y_1 \\ y_2 \\ \dots \\ y_n \end{pmatrix}, X = \begin{pmatrix} 1 & x_{11} & \dots & x_{1p} \\ 1 & x_{21} & \dots & x_{2p} \\ \dots & & & & \\ 1 & x_{n1} & \dots & x_{np} \end{pmatrix}, \beta = \begin{pmatrix} \beta_0 \\ \beta_1 \\ \dots \\ \beta_p \end{pmatrix}$$

. So we can write the mean function in matrix terms as  $E[Y|X] = X\beta$ .

Errors:  $e_i = y_i - \mathbf{x}_i' \beta$  and  $\mathbf{e} = (e_1, ..., e_n)', \mathbf{x}_i'$  is X's  $i^{th}$  row;

Normality assumption:  $\mathbf{e}|X \sim \mathbf{N}(\mathbf{0}, \sigma^2 \mathbf{I}_n);$ 

#### **OLS** Estimators

Minimizing the residual sum of squares function  $RSS((\beta)) = \sum (y_i - \mathbf{x}_i^{'}\beta)^2 = (Y - X\beta)^{'}(Y - X\beta)$ , we get the OLS estimates:

 $\hat{\beta} = (X'X)^{-1}X'Y,$ 

if  $(X'X)^{-1}$  exists.

## library(alr4)

## Loading required package: car

## Loading required package: carData

## Loading required package: effects

## lattice theme set by effectsTheme()

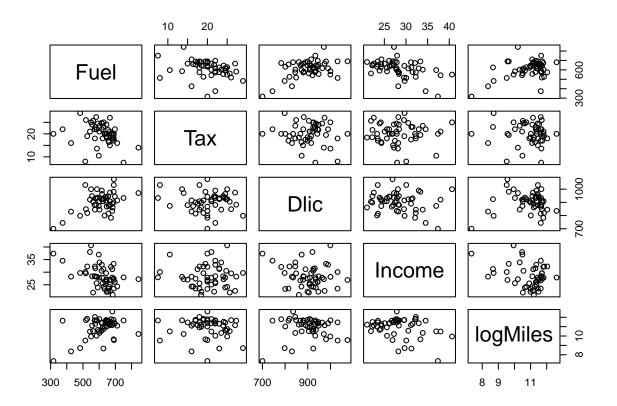
## See ?effectsTheme for details.

# **Fuel Consumption**

Textbook example. Data introduced in page 15. Goal: how fuel consumption varies over different US areas?

```
#?fuel2001
fuel <- transform(fuel2001,</pre>
    Dlic=1000 * Drivers/Pop,
     Fuel=1000 * FuelC/Pop,
     logMiles=log(Miles),
     Income=Income/1000)
fuel <- subset(fuel, select = -c(Drivers, FuelC, MPC, Pop, Miles))</pre>
head(fuel)
##
      Income Tax
                       Dlic
                               Fuel logMiles
## AL 23.471 18.0 1031.3801 690.2644 11.455720
## AK 30.064 8.0 1031.6411 514.2792 9.519882
## AZ 25.578 18.0 908.5972 621.4751 10.919533
## AR 22.257 21.7 946.5706 655.2927 11.494069
## CA 32.275 18.0 844.7033 573.9129 12.036298
## CO 32.949 22.0 989.6062 616.6115 11.360403
#Textbook page 58
nrow(fuel) #N=51
## [1] 51
summary(fuel)
##
        Income
                                         Dlic
                                                          Fuel
                        Tax
##
   Min.
          :20.99
                   Min.
                          : 7.50
                                   Min. : 700.2
                                                   Min.
                                                            :317.5
##
   1st Qu.:25.32
                   1st Qu.:18.00
                                   1st Qu.: 864.1
                                                    1st Qu.:575.0
  Median :27.87
                   Median :20.00
                                   Median : 909.1
                                                    Median :626.0
          :28.40
                          :20.15
                                   Mean : 903.7
## Mean
                    Mean
                                                     Mean
                                                            :613.1
   3rd Qu.:31.21
                    3rd Qu.:23.25
                                   3rd Qu.: 943.0
##
                                                     3rd Qu.:666.6
##
  Max.
          :40.64
                    Max.
                          :29.00
                                   Max. :1075.3
                                                     Max.
                                                            :842.8
##
      logMiles
## Min.
          : 7.336
## 1st Qu.:10.507
## Median :11.276
## Mean
         :10.914
## 3rd Qu.:11.634
## Max.
          :12.614
#Textbook page 17 and 59
```

pairs(Fuel~Tax + Dlic + Income + logMiles, data=fuel)



#### #plot(fuel)

# #Textbook page 59 Table 3.2 cor(fuel)

```
##
              Income
                           Tax
                                    Dlic
                                              Fuel
                                                     logMiles
           1.00000000 \ -0.01068494 \ -0.17596063 \ -0.4644050 \ -0.29585136
## Income
## Tax
          ## Dlic
          -0.17596063 -0.08584424 1.00000000 0.4685063 0.03059068
## Fuel
          -0.46440498 -0.25944711 0.46850627
                                         1.0000000 0.42203233
## logMiles -0.29585136 -0.04373696 0.03059068 0.4220323 1.00000000
```

Model: Fuel~Tax+Dlic+Income+log(Miles).

```
fit <- lm(Fuel~Tax+Dlic+Income+logMiles, data = fuel)
summary(fit)</pre>
```

```
##
## Call:
## lm(formula = Fuel ~ Tax + Dlic + Income + logMiles, data = fuel)
##
## Residuals:
## Min 1Q Median 3Q Max
## -163.145 -33.039 5.895 31.989 183.499
```

```
##
## Coefficients:
             Estimate Std. Error t value Pr(>|t|)
## (Intercept) 154.1928 194.9062 0.791 0.432938
                         2.0301 -2.083 0.042873 *
             -4.2280
## Tax
## Dlic
              0.4719
                      0.1285 3.672 0.000626 ***
## Income
             -6.1353
                      2.1936 -2.797 0.007508 **
                      9.3374 2.865 0.006259 **
## logMiles
            26.7552
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## Residual standard error: 64.89 on 46 degrees of freedom
## Multiple R-squared: 0.5105, Adjusted R-squared: 0.4679
## F-statistic: 11.99 on 4 and 46 DF, p-value: 9.331e-07
```