### HW week 10

### w203: Statistics for Data Science

1. Recall that the slope coefficient in a simple regression of  $Y_i$  on  $X_i$  can be expressed as,

$$\beta_1 = \frac{c\hat{o}v(X_i, Y_i)}{v\hat{a}r(X_i)}$$

Suppose that you were to add a random variable,  $M_i$ , representing measurement error, to each  $X_i$ . You may assume that  $M_i$  is uncorrelated with both  $X_i$  and  $Y_i$ . You then run a regression of  $Y_i$  on  $X_i + M_i$  instead of on  $X_i$ . Does the measurement error increase or decrease your slope coefficient?

The file bwght.RData contains data from the 1988 National Health Interview Survey. It was used by J Mullahy for a 1997 paper ("Instrumental-Variable Estimation of Count Data Models: Applications to Models of Cigarette Smoking Behavior," Review of Economics and Statistics 79, 596-593.) and provide by Wooldridge. You will use this data to examine the relationship between cigarette smoking and a child's birthweight.

#### load("bwght.RData")

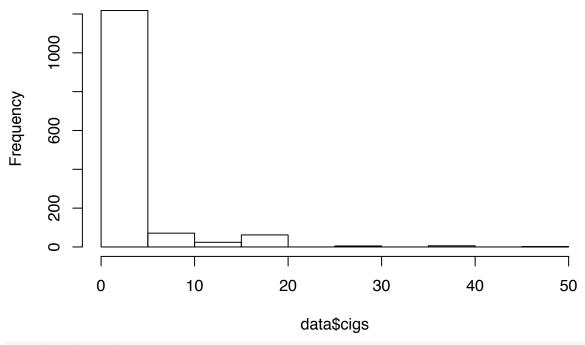
1. Examine the dependent variable, infant birth weight in ounces (bwght) and the independent variable, the number of cigarettes smoked by the mother each day during pregnacy (cigs).

#### summary(data)

```
##
        faminc
                          cigtax
                                           cigprice
                                                              bwght
##
    Min.
            : 0.50
                      Min.
                             : 2.00
                                       Min.
                                               :103.8
                                                         Min.
                                                                 : 23.0
                                       1st Qu.:122.8
##
    1st Qu.:14.50
                      1st Qu.:15.00
                                                         1st Qu.:107.0
##
    Median :27.50
                      Median :20.00
                                       Median :130.8
                                                         Median :120.0
            :29.03
                                               :130.6
##
    Mean
                      Mean
                              :19.55
                                       Mean
                                                         Mean
                                                                 :118.7
##
    3rd Qu.:37.50
                      3rd Qu.:26.00
                                       3rd Qu.:137.0
                                                         3rd Qu.:132.0
##
    Max.
            :65.00
                      Max.
                              :38.00
                                       Max.
                                               :152.5
                                                         Max.
                                                                 :271.0
##
##
       fatheduc
                         motheduc
                                                               male
                                            parity
    Min.
            : 1.00
                              : 2.00
##
                      Min.
                                       Min.
                                               :1.000
                                                         Min.
                                                                 :0.0000
##
    1st Qu.:12.00
                      1st Qu.:12.00
                                       1st Qu.:1.000
                                                         1st Qu.:0.0000
    Median :12.00
                      Median :12.00
                                       Median :1.000
                                                         Median :1.0000
##
##
    Mean
            :13.19
                      Mean
                              :12.94
                                       Mean
                                               :1.633
                                                         Mean
                                                                 :0.5209
    3rd Qu.:16.00
                      3rd Qu.:14.00
##
                                       3rd Qu.:2.000
                                                         3rd Qu.:1.0000
##
    Max.
            :18.00
                      Max.
                              :18.00
                                       Max.
                                               :6.000
                                                         Max.
                                                                 :1.0000
    NA's
            :196
                      NA's
                              :1
##
##
        white
                            cigs
                                              lbwght
                                                               bwghtlbs
##
    Min.
            :0.0000
                       Min.
                               : 0.000
                                          Min.
                                                 :3.135
                                                           Min.
                                                                   : 1.438
##
    1st Qu.:1.0000
                       1st Qu.: 0.000
                                          1st Qu.:4.673
                                                           1st Qu.: 6.688
    Median :1.0000
                       Median : 0.000
                                                           Median : 7.500
##
                                          Median :4.787
            :0.7846
                                                                   : 7.419
##
                               : 2.087
                                                 :4.760
    Mean
                       Mean
                                          Mean
                                                           Mean
##
    3rd Qu.:1.0000
                       3rd Qu.: 0.000
                                          3rd Qu.:4.883
                                                           3rd Qu.: 8.250
##
    Max.
            :1.0000
                       Max.
                               :50.000
                                          Max.
                                                  :5.602
                                                           Max.
                                                                   :16.938
##
##
        packs
                          lfaminc
    Min.
            :0.0000
                               :-0.6931
##
                       Min.
    1st Qu.:0.0000
                       1st Qu.: 2.6741
##
    Median :0.0000
                       Median : 3.3142
```

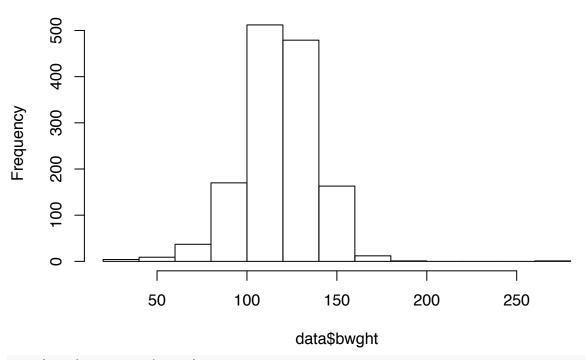
```
## Mean :0.1044
                    Mean : 3.0713
## 3rd Qu.:0.0000 3rd Qu.: 3.6243
## Max. :2.5000 Max. : 4.1744
##
desc
      variable
                                       label
       faminc
                  1988 family income, $1000s
## 1
## 2
       cigtax
                cig. tax in home state, 1988
## 3
    cigprice cig. price in home state, 1988
        bwght
                        birth weight, ounces
## 5 fatheduc
                        father's yrs of educ
## 6 motheduc
                        mother's yrs of educ
## 7
       parity
                        birth order of child
## 8
         male
                            =1 if male child
## 9
                                 =1 if white
        white
## 10
         cigs cigs smked per day while preg
## 11
       lbwght
                                log of bwght
## 12 bwghtlbs
                        birth weight, pounds
        packs packs smked per day while preg
## 14 lfaminc
                                 log(faminc)
summary(data$cigs)
     Min. 1st Qu. Median
                             Mean 3rd Qu.
                                             Max.
                    0.000
     0.000
           0.000
                            2.087
                                    0.000 50.000
##
summary(data$bwghtlbs)
##
     Min. 1st Qu. Median
                            Mean 3rd Qu.
                                             Max.
     1.438
            6.688
                   7.500
                            7.419
                                  8.250 16.940
hist(data$cigs)
```

# Histogram of data\$cigs

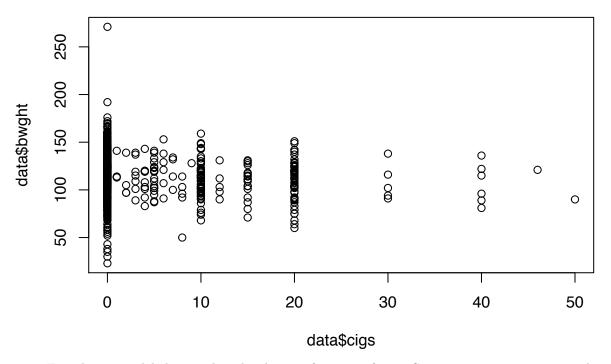


hist(data\$bwght)

# Histogram of data\$bwght

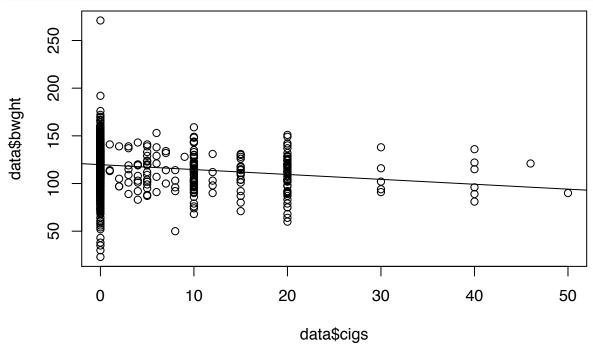


plot(data\$cigs, data\$bwght)



2. Fit a linear model that predicts bught as a function of cigs. Superimpose your regression line on a scatterplot of your variables.

```
m = lm(bwght ~ cigs, data = data)
plot(data$cigs, data$bwght)
abline(m)
```



3. Examine the coefficients of your fitted model. Explain, in particular, how to interpret the slope coefficient on cigs. Is it practically significant?

coef(m)

```
## (Intercept) cigs
## 119.7719004 -0.5137721
```

# each cigarette smoked during pregnancy is associated with about half an ounce lower birthweight.

- 4. Write down the two moment conditions for this regression. Use R to verify that they hold for your fitted model.
- 5. Does this simple regression capture a causal relationship between smoking and birthweight? Explain why or why not.
- 6. Does your scatterplot show evidence of measurement error in cigs? If so, what does this say about the true relationship between cigarettes and birthweight?
- 7. Using your coefficients, what is the predicted birthweight when cigs is 0? When cigs is 20?
- 8. Use R's predict function to verify your previous answers. You may insert your linear model object into the command below.

```
predict(your_lm_object , data.frame(cigs = c(0, 20) ) )
```

9. To predict a birthweight of 100 ounces, what would cigs have to be?