## Problem Set 3

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## Question 1

- a)  $U_i$  represents all other variables that influence a student's score beyond the time they had, such as intelligence, preparedness, and test taking ability.
- b) The experiment designed  $U_i$  and  $X_i$  as independent (since time doesn't affect other factors), so it follows that  $E(U_i|X_i)$  are independent.

```
c) \hat{Y}_i = 49 + 0.24X_i

X_i = 90

\hat{Y}_i = 49 + 0.24 \times 90

\hat{Y}_i = 70.6
```

- d) Estimated gain =  $0.24 \times 10 = 2.4$  points
- e) The predicted score is  $49 + 0.24 \times 240 = 106.6$ . This prediction should not be taken seriously because it is extrapolating the data beyond the scope of the experiment's length and the covariate's bound. Just because an exam is longer does not mean all students score more than is possible.

## Question 2

```
a)
m1 <- lm(ed~dist, data=college)
coef(m1)

## (Intercept) dist
## 13.95585611 -0.07337271
```

The estimated intercept is about 13.96, which translates to 139.6 miles away, with an estimated slope of -0.073, meaning each additional 10 miles distance between high school and the nearest college reduces years of education by .073.

b) With a 20 mile distance, since distances are measured in 10s of miles, X=2.

Years of completed education 20 miles away:

```
b0.hat + 2*b1.hat  
## (Intercept)  
## 13.80911  
With a 20 mile distance, since distances are measured in 10s of miles, X = 1.
```

Years of completed education 10 miles away:

```
b0.hat + 1*b1.hat

## (Intercept)

## 13.88248
```

Bob's years of college completed increases by .073 if his high school was 10 miles closer.

```
c)
summary(m1)
##
## Call:
## lm(formula = ed ~ dist, data = college)
##
## Residuals:
##
       Min
                1Q Median
                                 3Q
                                         Max
## -1.9559 -1.8091 -0.6624 2.0515 4.4844
##
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 13.95586
                            0.03772 369.945
                                               <2e-16 ***
## dist
               -0.07337
                            0.01375 -5.336
                                                1e-07 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 1.807 on 3794 degrees of freedom
## Multiple R-squared: 0.00745,
                                      Adjusted R-squared: 0.007188
## F-statistic: 28.48 on 1 and 3794 DF, p-value: 1.004e-07
The reported value of R^2 = 0.00745, so only a miniscule fraction of variance in education completed is
explained by distance from one's high school to the nearest college. This makes sense as many other factors
are at play.
 d)
coeftest(m1, vcov=vcovHC(m1, type = "HC1"))
## t test of coefficients:
##
##
                Estimate Std. Error t value Pr(>|t|)
                            0.037811 369.0934 < 2.2e-16 ***
## (Intercept) 13.955856
               -0.073373
                            0.013433 -5.4619 5.012e-08 ***
## dist
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
The standard error of the slope is about 0.013, which yields a t-value of -5.46, giving an associated p-value of
5.012 \times 10^{-8}. We can therefore reject the null hypothesis at all above-stated levels.
  e)
se.b1.hat <- coeftest(m1, vcov=vcovHC(m1, type = "HC1"))[2,2]
  f)
lb = b1.hat - se.b1.hat*1.96
ub = b1.hat + se.b1.hat*1.96
1b
##
          dist
## -0.09970223
ub
##
          dist
## -0.04704319
```

```
The confidence interval is (-0.0997, -0.0470)
  g)
m2 = lm(ed~dist, data=college, subset=female==1)
b0.hat.women <- coef(m2)[1]
b1.hat.women <- coef(m2)[2]
b0.hat.women
## (Intercept)
     13.93587
b1.hat.women
##
         dist
## -0.06416757
coeftest(m2, vcov=vcovHC(m2, type = "HC1"))
##
## t test of coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 13.935867  0.051324 271.5293 < 2.2e-16 ***
             ## dist
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
se.b1.hat.women <- coeftest(m2, vcov=vcovHC(m2, type = "HC1"))[2,2]</pre>
lb_women = b1.hat.women - se.b1.hat.women*1.96
ub_women = b1.hat.women + se.b1.hat.women*1.96
1b_women
##
        dist
## -0.100317
ub_women
##
          dist
## -0.02801814
The confidence interval is (-0.1003, -0.0280)
 h)
m3 = lm(ed~dist, data=college, subset=female==0)
b0.hat.men <- coef(m3)[1]
b1.hat.men <- coef(m3)[2]
b0.hat.men
## (Intercept)
##
     13.97899
b1.hat.men
         dist
## -0.08383705
coeftest(m3, vcov=vcovHC(m3, type = "HC1"))
```

##

```
## t test of coefficients:
##
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) 13.978992
                           0.055920 249.9813 < 2.2e-16 ***
## dist
               -0.083837
                           0.019573 -4.2833 1.943e-05 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
se.b1.hat.men <- coeftest(m3, vcov=vcovHC(m3, type = "HC1"))[2,2]
lb_men = b1.hat.men - se.b1.hat.men*1.96
ub_men = b1.hat.men + se.b1.hat.men*1.96
lb_men
##
         dist
## -0.1222004
ub_men
##
          dist
## -0.04547365
The confidence interval is (-0.1222, -0.0455)
```

We can compute the t-value for this independent data using the formula below:

$$t = \frac{\hat{B}_{1,women} - \hat{B}_{1,men}}{\sqrt{SE(\hat{B}_{1,women})^2 + SE(\hat{B}_{1,men})^2}}$$
$$t = \frac{0.01967}{0.02689} = 0.7314$$

This t-value indicates that the null hypothesis cannot be rejected at any significance level above .6384, which is the p-value. Therefore, the distance to college does not affect men and women differently, and is therefore due to other or unexplained factors.