

414HW3

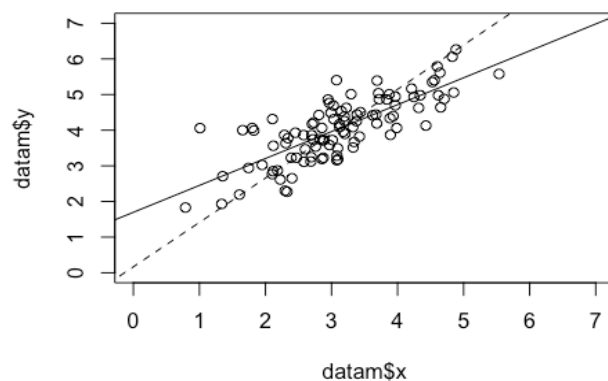
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1.

- a. In the following plot, the solid line represents the linear model with y as the response and x as the predictor. The dashed line represents the linear model reversing the roles of x and y.

```
lm = lm(y~x, data = datam)
lm_rev = lm(x~y, data = datam)
# summary(lm_rev)
newy = seq(-1, 8, length = 50)
newx = coef(lm_rev)[1] + coef(lm_rev)[2]*newy
plot(datam$x, datam$y, xlim = c(0,7), ylim = c(0,7)) + abline(lm)
lines(newx, newy, lty = 2)
```



- b. The R_squared, T-stats associated with the predictors and their respective p-values, F-stats and p-values from the two models are the same.

```
# r_squared
summary(lm)$r.squared
## [1] 0.606287

summary(lm_rev)$r.squared
## [1] 0.606287

# t-stats
summary(lm)$coefficients

##           Estimate Std. Error  t value    Pr(>|t|)
## (Intercept) 1.6969772 0.19998330  8.485595 2.309177e-13
## x           0.7547914 0.06144191 12.284635 1.495934e-21

summary(lm_rev)$coefficients
```

```
##           Estimate Std. Error    t value    Pr(>|t|)
## (Intercept) -0.1348023 0.27138014 -0.4967285 6.204930e-01
## y           0.8032510 0.06538664 12.2846353 1.495934e-21

# F-stats
summary(lm)$fstatistic

##      value      numdf      dendf
## 150.9123      1.0000     98.0000

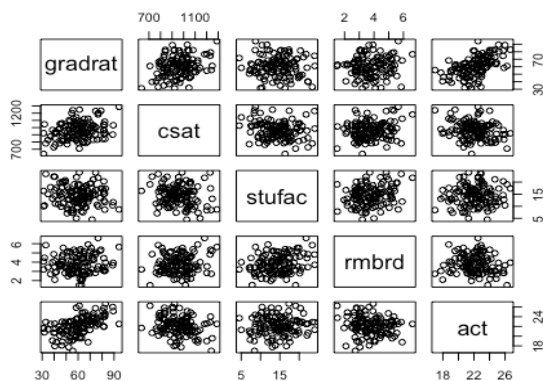
summary(lm_rev)$fstatistic

##      value      numdf      dendf
## 150.9123      1.0000     98.0000

# summary(Lm)
# summary(Lm_rev)
```

c. Please check the hand-written part below.

2.



```
lm_dat = lm(gradrat ~ csat + private + stufac + rmbrd + act, data = dat)
# summary(Lm_dat)
```

b. F-stat is 1.1251 and p-value is 0.342. Since p-value > 0.05, do not reject H0.

```
lm_t1 = lm(gradrat ~ csat + act, data = dat)
anova(lm_t1, lm_dat)

## Analysis of Variance Table
##
## Model 1: gradrat ~ csat + act
## Model 2: gradrat ~ csat + private + stufac + rmbrd + act
##   Res.Df  RSS Df Sum of Sq    F Pr(>F)
## 1     117 11217
## 2     114 10895   3    322.56 1.1251 0.342
```

c. F-stat is 0.6348 and p-value is 0.4272. Since p-value > 0.05, do not reject H0.

```
lm_t2 = lm(gradrat ~ offset(0.05*csat) + private + stufac + rmbrd + act, data = dat)
anova(lm_t2, lm_dat)
```

```
## Analysis of Variance Table
##
## Model 1: gradrat ~ offset(0.05 * csat) + private + stufac + rmbrd + act
## Model 2: gradrat ~ csat + private + stufac + rmbrd + act
##   Res.Df    RSS Df Sum of Sq      F Pr(>F)
## 1      115 10955
## 2      114 10895   1    60.668 0.6348 0.4272
```

d. F-stat is 44.565 and p-value is close to 0. Since p-value < 0.05, reject H0.

```
lm_t3 = lm(gradrat ~ csat + private + stufac, data = dat)
anova(lm_t3, lm_dat)
```

```
## Analysis of Variance Table
##
## Model 1: gradrat ~ csat + private + stufac
## Model 2: gradrat ~ csat + private + stufac + rmbrd + act
##   Res.Df    RSS Df Sum of Sq      F    Pr(>F)
## 1      116 19412
## 2      114 10895   2    8517.9 44.565 5.018e-15 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

e. F-stat is 7.8216 and p-value is 0.006. Since p-value < 0.05, reject H0.

```
lm_t4 = lm(gradrat ~ csat + private + stufac + I(rmbrd + act), data = dat)
anova(lm_t4, lm_dat)
```

```
## Analysis of Variance Table
##
## Model 1: gradrat ~ csat + private + stufac + I(rmbrd + act)
## Model 2: gradrat ~ csat + private + stufac + rmbrd + act
##   Res.Df    RSS Df Sum of Sq      F    Pr(>F)
## 1      115 11642
## 2      114 10895   1    747.49 7.8216 0.006061 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

3.

beta0_hat is 1, beta1_hat is -0.5, and beta2_hat is 0.5. The estimates for beta0_hat and beta1_hat remain unchanged if beta2 is 0.

```
dat3 = matrix(c(1,0,-1,1,0,2), ncol = 2)
dat3 = as.data.frame(dat3)
colnames(dat3) = c("x", "y")

lm3 = lm(y~x + I(3*x^2 - 2), data = dat3)
lm3$coefficients

##      (Intercept)              x I(3 * x^2 - 2)
##             1.0             -0.5             0.5

lm4 = lm(y~x, data = dat3)
lm4$coefficients

##      (Intercept)              x
##             1.0             -0.5
```

1c. Under $H_0: \beta = 0$

$$T_{y|x} = \frac{\hat{\beta}}{\text{se}(\hat{\beta})}, \text{ we already know } \hat{\beta} = \frac{S_{xy}}{S_{xx}}$$

$$\& \text{Var}(\hat{\beta}) = \frac{\hat{\sigma}^2}{S_{xx}}$$

$$\text{since } \hat{\sigma}^2 = \frac{1}{n-2} \text{SSE} = \frac{\text{SST} - \text{SSR}}{n-2} = \frac{S_{yy} - \hat{\beta}^2 S_{xx}}{n-2}$$

$$= \frac{S_{xx} S_{yy} - S_{xy}^2}{(n-2) S_{xx}}$$

$$\text{so, } \text{Var}(\hat{\beta}) = \frac{S_{xx} S_{yy} - S_{xy}^2}{(n-2) S_{xx}^2}$$

$$T_{y|x} = \frac{S_{xy}}{S_{xx}} \frac{\sqrt{(n-2) S_{xx}}}{\sqrt{S_{xx} S_{yy} - S_{xy}^2}} = \frac{S_{xy} \sqrt{n-2}}{\sqrt{S_{xx} S_{yy} - S_{xy}^2}}$$

If we reverse the role between x and y , then

$S_{xx} \rightarrow S_{yy}$ and $S_{yy} \rightarrow S_{xx}$; $S_{xy} = S_{yx}$ unchanged.

$$T_{x|y} = \frac{S_{xy} \sqrt{n-2}}{\sqrt{S_{yy} S_{xx} - S_{xy}^2}} = T_{y|x}$$

4a. we already know: $R^2 = \frac{\text{SSR}}{\text{SST}} \Rightarrow \text{SSR} = R^2 \cdot \text{SST}$
 $\text{SSE} = \text{SST} - \text{SSR} = (1 - R^2) \text{SST}$

$$F = \frac{(\text{SST} - \text{SSE}) / (p-1)}{\text{SSE} / (n-p)} = \frac{R^2 \cdot \cancel{\text{SST}}}{(p-1)} \cdot \frac{(n-p)}{(1-R^2) \cancel{\text{SST}}}$$

$$= \frac{n-p}{p-1} \cdot \frac{R^2}{1-R^2}$$

As $R^2 \rightarrow 0$, $F \rightarrow 0^+$

As $R^2 \rightarrow 1$, $F \rightarrow \infty$

note:
 $\frac{n-p}{p-1}$ is
always > 1

4b. $\text{cov}(\hat{y}, e) = \text{cov}(Py, (I_n - P)y)$

$$= P \text{cov}(y, y) (I_n - P)$$

$$= \sigma^2 (I_n - P) P \rightarrow \text{since } P \text{ is idempotent}$$

$$= 0$$