

1.

```
Call:
lm(formula = TGRAMS ~ SMOKE, data = ncbwt)

Residuals:
    Min       1Q   Median       3Q      Max
-2662.0  -206.5    59.6   343.1  1250.3

Coefficients:
            Estimate Std. Error t value Pr(>|t|)
(Intercept)  3285.70      46.28   70.989  <2e-16 ***
SMOKE        -179.92     123.10   -1.462    0.146
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 592.7 on 189 degrees of freedom
Multiple R-squared:  0.01118,    Adjusted R-squared:  0.005944
F-statistic: 2.136 on 1 and 189 DF,  p-value: 0.1455
```

$$E(Y|SMOKE) = \beta_0 + \beta_1 SMOKE = 3285.7 - 179.92 * smoke$$

$$E(Y|Smoker) = 3285.7 - 179.92 * 1 = 3105.78$$

$$E(Y|Non-smoker) = 3285.7 - 179.92 * 0 = 3285.7$$

95% CI for β_0 (3194.4011, 3377.0020) and β_1 (-422.7567, 62.9092).

2.

```
Call:
lm(formula = TGRAMS ~ as.factor(RACEMOM), data = ncbwt)

Residuals:
    Min       1Q   Median       3Q      Max
-2575.34  -205.37    61.21   373.06  1268.83

Coefficients:
            Estimate Std. Error t value Pr(>|t|)
(Intercept)  3267.17      51.24   63.759  <2e-16 ***
as.factor(RACEMOM)2  -68.13      97.60   -0.698    0.486
as.factor(RACEMOM)3  359.40     247.52    1.452    0.148
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 593.2 on 188 degrees of freedom
Multiple R-squared:  0.01493,    Adjusted R-squared:  0.004451
F-statistic: 1.425 on 2 and 188 DF,  p-value: 0.2431
```

$$E(\text{Birth Weight}|\text{Race}) = \beta_0 + \beta_1 * \text{Black} + \beta_2 * \text{Other}$$

$$E(\text{Birth Weight}|\text{White}) = 3267.17 - 68.13 * \text{black} + 359.4 * \text{other}$$

$$E(\text{Birth Weight}|\text{Black}) = 3267.17 - 68.13 * 1 = 3199.04$$

$$E(\text{Birth Weight}|\text{Other}) = 3267.17 + 359.4 \cdot 1 = 3626.57$$

Hypothesis: Blacks infants have a significantly lower mean birth weight than both white and non-black minority infants.

Ans: Mean birth weight of black infants significantly differs from that for white infants as white infants are the reference group ($p < .0001$). However, non-black minority infants do not significantly differ from the white infants in terms of mean birth weight ($p = 0.3165687$).

3.

```
Call:
lm(formula = TGRAMS ~ SMOKE + GEST, data = ncbwt)

Residuals:
    Min       1Q   Median       3Q      Max
-1360.42  -273.90    8.48   321.40  1467.97

Coefficients:
            Estimate Std. Error t value Pr(>|t|)
(Intercept) -1632.54    449.68  -3.630 0.000365 ***
SMOKE        -159.87     96.39  -1.659 0.098861 .
GEST         127.04     11.58   10.973 < 2e-16 ***
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 464 on 188 degrees of freedom
Multiple R-squared:  0.3972,    Adjusted R-squared:  0.3908
F-statistic: 61.94 on 2 and 188 DF,  p-value: < 2.2e-16
```

$$E(\text{Weight}/\text{smoke}, \text{Gest}) = b_0 + b_1 \text{Smoke} + b_2 \text{Gest}$$

$$E(\text{Weight}/\text{smoker}, \text{Gest}) = -1632.54 - 159.87 \cdot \text{smoke} + 127.04 \cdot \text{gest}$$

$$E(\text{Weight}/\text{Non smoker}, \text{Gest}) = -1632.54 + 127.04 \cdot \text{gest}$$

95% CI for the “Smoking Effect” for infants with a given gestational age is -350.0083 and 30.27035.

Thus adjusting for gestational age, we estimate that the mean birth weight of infants born to smoking mothers is between 30.27035g and -350.0083g lower than the mean birth weight of infants born to non-smoking mothers.

Q: What if the effect of gestational age is different for smokers and non-smokers? For example, maybe for smokers an additional week of gestational age does not translate to the same increase in birth weight as it does for non-smokers? What should we do?

A: Add a smoking and gestational age interaction term, *Smoking*Gest*, which will allow the lines for smokers and nonsmokers to different slopes.

It is like q 4. $E\left(\frac{\text{Weight}}{\text{smoker}}, \text{Gest}\right) = -1899.53 + 1331.07 \cdot \text{Smoke} + 133.94 \cdot \text{Gest} - 38.64 \cdot \text{Smoke} \cdot \text{Gest} = -569.46 + 95.3 \cdot \text{gest}$

4.

Call:
lm(formula = TGRAMS ~ SMOKE + GEST + SMOKE * GEST, data = ncbwt)

Residuals:
Min 1Q Median 3Q Max
-1251.1 -286.7 13.4 315.0 1479.8

Coefficients:
Estimate Std. Error t value Pr(>|t|)
(Intercept) -1899.53 495.00 -3.837 0.00017 ***
SMOKE 1331.07 1168.62 1.139 0.25616
GEST 133.94 12.75 10.503 < 2e-16 ***
SMOKE:GEST -38.64 30.19 -1.280 0.20207

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

Residual standard error: 463.2 on 187 degrees of freedom
Multiple R-squared: 0.4025, Adjusted R-squared: 0.3929
F-statistic: 41.98 on 3 and 187 DF, p-value: < 2.2e-16

$$E\left(\frac{\text{Weight}}{\text{smoker}}, \text{Gest}\right) = -1899.53 + 1331.07 * \text{Smoke} + 133.94 * \text{Gest} - 38.64 * \text{Smoke} * \text{Gest}$$

$$= -569.46 + 95.3 * \text{gest}$$

$$E(\text{Weight}/\text{Non smoker}, \text{Gest}) = -1899.53 + 133.94 * \text{Gest}$$

Test: $H_0: \beta_{12} = 0$ ha: β_{12} is not equal to 0

```
> anova(c, d)
Analysis of Variance Table

Model 1: TGRAMS ~ SMOKE + GEST
Model 2: TGRAMS ~ SMOKE + GEST + SMOKE * GEST
  Res.Df    RSS Df Sum of Sq    F Pr(>F)
1    188 40477547
2    187 40125896  1    351651 1.6388 0.2021
> e = lm(TGRAMS ~ SMOKE+as.factor(RACEMOM)+GEST)
> summary(e)
```

F=1.6388 and p value=0.2021>0.05 so fail to reject H_0 and state that it is equal to 0.

5.

Call:
lm(formula = TGRAMS ~ SMOKE + as.factor(RACEMOM) + GEST)

Residuals:
Min 1Q Median 3Q Max
-1372.65 -277.30 6.35 305.41 1449.42

Coefficients:
Estimate Std. Error t value Pr(>|t|)
(Intercept) -1582.26 451.03 -3.508 0.000566 ***
SMOKE -161.91 96.96 -1.670 0.096628 .
as.factor(RACEMOM)2 -81.98 76.60 -1.070 0.285912
as.factor(RACEMOM)3 161.43 194.87 0.828 0.408510
GEST 126.18 11.61 10.866 < 2e-16 ***

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

Residual standard error: 463.9 on 186 degrees of freedom
Multiple R-squared: 0.4038, Adjusted R-squared: 0.391
F-statistic: 31.5 on 4 and 186 DF, p-value: < 2.2e-16

$E(\text{Weight/smoke, Race, Gest}) = -1582.26 - 161.91 * \text{Smoke} - 81.98 * \text{Black} + 161.43 * \text{Other} + 126.18 * \text{Gest}$

$E(\text{Weight/smoker, white, Gest}) = -1744.17 + 126.18 * \text{Gest}$

Find: $E(\text{Weight/Non smoker, white, Gest}) = -1582.26 + 126.18 * \text{Gest}$

Find: $E(\text{Weight/smoker, black, Gest}) = -1826.15 + 126.18 * \text{Gest}$

Find: $E(\text{Weight/Non smoker, black, Gest}) = -1664.24 + 126.18 * \text{Gest}$

Find: $E(\text{Weight/smoker, other, Gest}) = -1582.74 + 126.18 * \text{Gest}$

Find: $E(\text{Weight/Non smoker, other, Gest}) = -1420.83 + 126.18 * \text{Gest}$

6.

Call:

```
lm(formula = TGRAMS ~ MAGE + GEST + as.factor(RACEMOM) + GAINED +
    SMOKE + DRINK, data = ncbwt)
```

Residuals:

Min	1Q	Median	3Q	Max
-1155.76	-258.65	4.14	294.75	1236.21

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	-2226.591	454.227	-4.902	2.08e-06 ***
MAGE	17.298	5.302	3.263	0.001317 **
GEST	123.867	10.999	11.262	< 2e-16 ***
as.factor(RACEMOM)2	6.941	75.667	0.092	0.927010
as.factor(RACEMOM)3	131.503	188.661	0.697	0.486667
GAINED	8.276	2.351	3.520	0.000545 ***
SMOKE	-100.432	93.375	-1.076	0.283537
DRINK	-60.637	71.001	-0.854	0.394203

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

Residual standard error: 438.5 on 183 degrees of freedom

Multiple R-squared: 0.476, Adjusted R-squared: 0.4559

F-statistic: 23.75 on 7 and 183 DF, p-value: < 2.2e-16

7. Fit a regression model in which the dependent variable is mark on the Final Exam, and the independent variables are Sex, Race, Quiz Average, Computer Average, and mark on the Midterm test.

What proportion of the variation in Final Exam mark is explained by the independent variables in the full model?

45.5%

What is the predicted Final Exam score for a Male student from Race A with a Quiz average of 8.5, a Computer average of 5, and a Midterm mark of 60%?

58.28467

Obtain a 95% prediction interval for the student described in the previous question.

27.89605,88.67329

Controlling for the other independent variables, are there any differences in the average performance of students from the different racial groups? Give the Null and alternate hypothesis, test statistic, the p-value, and conclusion.

Ho: $\beta_2 = 0$ Ha: $\beta_2 \neq 0$ F = 8.5544 p-value = 0.0006257 < α , so we reject null hypothesis and state that $\beta_2 \neq 0$.

Allowing for other predictors, is the student's sex related to mark on the Final Exam? Give the Null and alternate hypothesis, test statistic, the p-value, and conclusion.

Ho: $\beta_1 = 0$ Ha: $\beta_1 \neq 0$ F = 0.5506 p-value = 0.4615 > α , so we fail to reject null hypothesis and state that $\beta_1 = 0$.

Controlling for other independent variables in the model, is Quiz Average a useful predictor of mark on the Final Exam? Give the Null and alternate hypothesis, test statistic, the p-value, and conclusion.

Ho: $\beta_3 = 0$ Ha: $\beta_3 \neq 0$ F = 5.8789 p-value = 0.01891 < α , so we reject null hypothesis and state that $\beta_3 \neq 0$.

Code:

```
> ncbwt <- read.table(file.choose(),header=T)
> attach(ncbwt)
> names(ncbwt)
[1] "PLURAL" "SEX" "MAGE" "GEST" "MARITAL" "RACEMOM"
[7] "HISPMOM" "GAINED" "SMOKE" "DRINK" "TOUNCES" "TGRAMS"
[13] "LOW" "PREMIE"
> tail(ncbwt)
```

PLURAL SEX MAGE GEST MARITAL RACEMOM HISPMOM GAINED SMOKE

186	1	2	20	38	2	2	N	20	0
187	1	1	38	41	1	1	N	24	0
188	2	1	20	28	1	1	N	16	0
189	1	2	20	37	2	2	N	32	0
190	1	1	30	41	1	1	N	35	0
191	1	1	29	37	2	2	N	20	1

DRINK TOUNCES TGRAMS LOW PREMIE

186	0	120	3402.00	0	0
187	0	113	3203.55	0	0
188	0	39	1105.65	1	1
189	0	115	3260.25	0	0
190	0	147	4167.45	0	0
191	0	120	3402.00	0	0

> head(ncbwt)

PLURAL SEX MAGE GEST MARITAL RACEMOM HISPMOM GAINED SMOKE
DRINK

1	1	1	32	40	1	1	N	38	0	0
2	1	2	21	41	2	2	N	15	0	0
3	1	2	31	38	1	2	N	25	0	0
4	1	1	35	38	1	1	N	48	0	0
5	1	2	35	39	1	1	M	43	0	0
6	1	1	22	38	2	2	N	40	1	0

TOUNCES TGRAMS LOW PREMIE

1	111	3146.85	0	0
2	105	2976.75	0	0
3	110	3118.50	0	0
4	123	3487.05	0	0
5	117	3316.95	0	0
6	117	3316.95	0	0

```
> a = lm(TGRAMS ~ SMOKE, data = ncbwt)
> summary(a)
```

Call:

```
lm(formula = TGRAMS ~ SMOKE, data = ncbwt)
```

Residuals:

Min	1Q	Median	3Q	Max
-2662.0	-206.5	59.6	343.1	1250.3

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	3285.70	46.28	70.989	<2e-16 ***
SMOKE	-179.92	123.10	-1.462	0.146

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

Residual standard error: 592.7 on 189 degrees of freedom

Multiple R-squared: 0.01118, Adjusted R-squared: 0.005944

F-statistic: 2.136 on 1 and 189 DF, p-value: 0.1455

```
> confint(a)
```

	2.5 %	97.5 %
--	-------	--------

(Intercept)	3194.4011	3377.0020
-------------	-----------	-----------

SMOKE	-422.7567	62.9092
-------	-----------	---------

```
> b = lm(TGRAMS ~ as.factor(RACEMOM), data = ncbwt)
```

```
> summary(b)
```

Call:

```
lm(formula = TGRAMS ~ as.factor(RACEMOM), data = ncbwt)
```

Residuals:

Min	1Q	Median	3Q	Max
-2575.34	-205.37	61.21	373.06	1268.83

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	3267.17	51.24	63.759	<2e-16 ***
as.factor(RACEMOM)2	-68.13	97.60	-0.698	0.486
as.factor(RACEMOM)3	359.40	247.52	1.452	0.148

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

Residual standard error: 593.2 on 188 degrees of freedom

Multiple R-squared: 0.01493, Adjusted R-squared: 0.004451

F-statistic: 1.425 on 2 and 188 DF, p-value: 0.2431

> anova(b)

Analysis of Variance Table

Response: TGRAMS

	Df	Sum Sq	Mean Sq	F value	Pr(>F)
as.factor(RACEMOM)	2	1002634	501317	1.4248	0.2431

Residuals	188	66148983	351856		
-----------	-----	----------	--------	--	--

> aov.b <- aov(TGRAMS ~ as.factor(RACEMOM), data = ncbwt)

> TukeyHSD(aov.b)

Tukey multiple comparisons of means

95% family-wise confidence level

Fit: aov(formula = TGRAMS ~ as.factor(RACEMOM), data = ncbwt)


```
$`as.factor(RACEMOM)`
```

	diff	lwr	upr	p adj
2-1	-68.13117	-298.6940	162.4316	0.7648898
3-1	359.39726	-225.3617	944.1562	0.3165687
3-2	427.52843	-177.2797	1032.3365	0.2194716

```
> c = lm(TGRAMS ~ SMOKE+GEST, data = ncbwt)
```

```
> summary(c)
```

Call:

```
lm(formula = TGRAMS ~ SMOKE + GEST, data = ncbwt)
```

Residuals:

Min	1Q	Median	3Q	Max
-1360.42	-273.90	8.48	321.40	1467.97

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	-1632.54	449.68	-3.630	0.000365 ***
SMOKE	-159.87	96.39	-1.659	0.098861 .
GEST	127.04	11.58	10.973	< 2e-16 ***

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

Residual standard error: 464 on 188 degrees of freedom

Multiple R-squared: 0.3972, Adjusted R-squared: 0.3908

F-statistic: 61.94 on 2 and 188 DF, p-value: < 2.2e-16

```
> confint(c)
```

```

      2.5 %    97.5 %
(Intercept) -2519.6046 -745.46638
SMOKE      -350.0083  30.27035
GEST       104.2030 149.88143
> d = lm(TGRAMS ~ SMOKE+GEST+SMOKE*GEST, data = ncbwt)
> summary(d)

```

Call:

```
lm(formula = TGRAMS ~ SMOKE + GEST + SMOKE * GEST, data = ncbwt)
```

Residuals:

```

      Min       1Q   Median       3Q      Max
-1251.1  -286.7   13.4   315.0  1479.8

```

Coefficients:

```

      Estimate Std. Error t value Pr(>|t|)
(Intercept) -1899.53    495.00  -3.837 0.00017 ***
SMOKE       1331.07    1168.62   1.139 0.25616
GEST        133.94     12.75  10.503 < 2e-16 ***
SMOKE:GEST  -38.64     30.19  -1.280 0.20207

```

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

Residual standard error: 463.2 on 187 degrees of freedom

Multiple R-squared: 0.4025, Adjusted R-squared: 0.3929

F-statistic: 41.98 on 3 and 187 DF, p-value: < 2.2e-16

```
> anova(c, d)
```

Analysis of Variance Table

Model 1: TGRAMS ~ SMOKE + GEST

Model 2: TGRAMS ~ SMOKE + GEST + SMOKE * GEST

```
Res.Df  RSS Df Sum of Sq  F Pr(>F)
1  188 40477547
2  187 40125896  1  351651 1.6388 0.2021
> e = lm(TGRAMS ~ SMOKE+as.factor(RACEMOM)+GEST)
> summary(e)
```

Call:

```
lm(formula = TGRAMS ~ SMOKE + as.factor(RACEMOM) + GEST)
```

Residuals:

Min	1Q	Median	3Q	Max
-1372.65	-277.30	6.35	305.41	1449.42

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	-1582.26	451.03	-3.508	0.000566 ***
SMOKE	-161.91	96.96	-1.670	0.096628 .
as.factor(RACEMOM)2	-81.98	76.60	-1.070	0.285912
as.factor(RACEMOM)3	161.43	194.87	0.828	0.408510
GEST	126.18	11.61	10.866	< 2e-16 ***

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

Residual standard error: 463.9 on 186 degrees of freedom

Multiple R-squared: 0.4038, Adjusted R-squared: 0.391

F-statistic: 31.5 on 4 and 186 DF, p-value: < 2.2e-16

```
> f = lm(TGRAMS ~
MAGE+GEST+as.factor(RACEMOM)+GAINED+SMOKE+DRINK, data = ncbwt)
> summary(f)
```

Call:

```
lm(formula = TGRAMS ~ MAGE + GEST + as.factor(RACEMOM) + GAINED +
    SMOKE + DRINK, data = ncbwt)
```

Residuals:

Min	1Q	Median	3Q	Max
-1155.76	-258.65	4.14	294.75	1236.21

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	-2226.591	454.227	-4.902	2.08e-06 ***
MAGE	17.298	5.302	3.263	0.001317 **
GEST	123.867	10.999	11.262	< 2e-16 ***
as.factor(RACEMOM)2	6.941	75.667	0.092	0.927010
as.factor(RACEMOM)3	131.503	188.661	0.697	0.486667
GAINED	8.276	2.351	3.520	0.000545 ***
SMOKE	-100.432	93.375	-1.076	0.283537
DRINK	-60.637	71.001	-0.854	0.394203

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

Residual standard error: 438.5 on 183 degrees of freedom

Multiple R-squared: 0.476, Adjusted R-squared: 0.4559

F-statistic: 23.75 on 7 and 183 DF, p-value: < 2.2e-16

```
final <- read.table(file.choose(),header=T)
```

```
> h= lm (FinalExam~ Sex+ Race+ QuizAve+ CompAve + MidTerm, data=final)
```

```
> summary (h)
```

Call:

```
lm(formula = FinalExam ~ Sex + Race + QuizAve + CompAve + MidTerm,  
    data = final)
```

Residuals:

Min	1Q	Median	3Q	Max
-22.5436	-8.0723	-0.1649	8.9547	28.0303

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	10.6814	14.9350	0.715	0.47775
SexMale	2.8146	3.7932	0.742	0.46149
RaceB	16.5775	4.1021	4.041	0.00018 ***
RaceC	-0.4682	5.7945	-0.081	0.93592
QuizAve	4.7008	1.9387	2.425	0.01891 *
CompAve	-2.5861	1.7204	-1.503	0.13896
MidTerm	0.2960	0.1291	2.293	0.02603 *

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

Residual standard error: 12.94 on 51 degrees of freedom

Multiple R-squared: 0.4505, Adjusted R-squared: 0.3859

F-statistic: 6.969 on 6 and 51 DF, p-value: 1.896e-05

```
>
```

```
> Xh= c(1, 1, 0, 0, 8.5, 5, 60)
```

```
> Yhat = t(Xh) %*% h$coefficients
```

```
> s = sqrt( t(Xh) %*% vcov(h) %*% Xh )
```

```
> t = qt(1-0.05/2, 58-7)
```

```
> anova(h)
```

Analysis of Variance Table

Response: FinalExam

	Df	Sum Sq	Mean Sq	F value	Pr(>F)
Sex	1	65.3	65.30	0.3898	0.53517
Race	2	4134.6	2067.28	12.3404	4.255e-05 ***
QuizAve	1	1559.9	1559.88	9.3115	0.00361 **
CompAve	1	364.5	364.54	2.1761	0.14632
MidTerm	1	880.4	880.45	5.2557	0.02603 *
Residuals	51	8543.6	167.52		

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

```
> htwo= lm(FinalExam~ Sex+ QuizAve+ CompAve+ MidTerm, data=final)
```

```
> anova(htwo,h)
```

Analysis of Variance Table

Model 1: FinalExam ~ Sex + QuizAve + CompAve + MidTerm

Model 2: FinalExam ~ Sex + Race + QuizAve + CompAve + MidTerm

	Res.Df	RSS	Df	Sum of Sq	F	Pr(>F)
1	53	11409.7				
2	51	8543.6	2	2866.1	8.5544	0.0006257 ***

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

```
> hthree= lm(FinalExam~ Race+ QuizAve+ CompAve+ MidTerm, data=final)
```

```
> anova(hthree, h)
```

Analysis of Variance Table

Model 1: FinalExam ~ Race + QuizAve + CompAve + MidTerm

Model 2: FinalExam ~ Sex + Race + QuizAve + CompAve + MidTerm

	Res.Df	RSS	Df	Sum of Sq	F	Pr(>F)
--	--------	-----	----	-----------	---	--------

1	52	8635.8				
---	----	--------	--	--	--	--

2	51	8543.6	1	92.234	0.5506	0.4615
---	----	--------	---	--------	--------	--------

```
> hf= lm(FinalExam~ Sex+ Race+ CompAve+ MidTerm, data=final)
```

```
> anova(hf,h)
```

Analysis of Variance Table

Model 1: FinalExam ~ Sex + Race + CompAve + MidTerm

Model 2: FinalExam ~ Sex + Race + QuizAve + CompAve + MidTerm

	Res.Df	RSS	Df	Sum of Sq	F	Pr(>F)
--	--------	-----	----	-----------	---	--------

1	52	9528.5				
---	----	--------	--	--	--	--

2	51	8543.6	1	984.84	5.8789	0.01891 *
---	----	--------	---	--------	--------	-----------

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

```
>
```