Name: $\qquad$ TA: $\qquad$

| County | Population | Elevation | Longitude | Obama\% | Prediction | Squared Error |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| Broomfield | 57 | 5269 | 105.1 | 51.7 | 44.45 | 52.56 |
| Gilpin | 5 | 9141 | 105.5 | 56.7 | 49.44 | 52.71 |
| Denver | 620 | 5245 | 104.9 | 73.5 | 73.86 | 0.13 |
| Lake | 7 | 11580 | 106.3 | 60.4 | 55.50 | 24.01 |
| San Juan | 1 | 10791 | 107.7 | 52.6 | 56.49 | 15.13 |
| Clear Creek | 9 | 9676 | 105.7 | 54.2 | 51.01 | 10.18 |
| Ouray | 4 | 10236 | 107.8 | 51.5 | 55.85 | 18.92 |
| Sedgwick | 2 | 3802 | 102.4 | 31.3 | 33.63 | 5.43 |
| Teller | 23 | 9150 | 105.2 | 32.1 | 49.83 | 314.35 |
| Summit | 28 | 10959 | 106.1 | 61.0 | 55.11 | 34.69 |

Above is a table of presidential election results for Colorado counties. I ran a regression to find out whether population (in 1000s), elevation (in feet), and longitude predict anything about the percentage of people voting for Obama. My input and result in $R$ were

```
> lm(obamaPercent ~ population + elevation + longitude)
Coefficients:
(Intercept) Population Elevation Longitude
    -173 .053 .0018 1.95
```

1. Write the regression equation, using the numbers above.

Yhat $=-173+.053 \cdot$ Population $+.0018 \cdot$ Elevation $+1.95 \cdot$ Longitude
2. Fill in the columns for prediction and squared error.
3. Find the residual sum of squares.
sum(Squared Error) $=528.11$
4. Find the total sum of squares of the outcome.

Mean(Obama\%) = 52.5
Sum (Obama\% -52.5) ${ }^{2}=1463.44$
5. Find the sum of squares explained by the regression.
$S S_{\text {regression }}=1463.44-528.11=935.33$
6. What proportion of the total variance does the regression explain?
$R^{2}=935.33 / 1463.44=.64$
7. Convert the regression and residual sums of squares to mean squares. The degrees of freedom are $d f_{\text {regression }}=m=3$ and $d f_{\text {residual }}=n-m-1=6$.
$\mathrm{MS}_{\text {regression }}=935.33 / 3=311.78$
$\mathrm{MS}_{\text {residual }}=528.11 / 6=88.02$
8. Calculate the F statistic for deciding whether the regression explains meaningful variance in the outcome. $F=311.78 / 88.02=3.54$
9. The critical value (with $\alpha=5 \%$ ) is 4.76. What do you conclude? (Don't just write null or alternative.) There is not enough evidence to conclude the regression explains meaningful variation in counties' voting.
10. The standard error for $b_{\text {population }}$ is .019 . Calculate the $t$ statistic for testing whether this regression coefficient is reliably different from zero.
$\mathrm{t}=.053 / .019=2.79$
11. The two-tailed critical value is 2.45 . Write a sentence (about counties and voting, not about hypotheses) describing what you conclude.
Larger counties are reliably more in favor of Obama.
Here are data from an experiment comparing memory of people given lists of 20 items to remember. One group of subjects was given words, another was given faces, and a third was given pictures. Instead of giving you all the data, for each group I just give you the mean and a measure of variability in the sum of squares.

| Group | Size | Mean | Sum of Squares |
| :--- | :--- | :--- | :--- |
| Words | 20 | 9.5 | 205.7 |
| Faces | 24 | 12.1 | 231.2 |
| Pictures | 19 | 10.2 | 211.8 |

12. Find the grand mean. Hint: The sum of all the scores in each group equals the group mean times the number of people in that group.
$\operatorname{sum}(X)=\operatorname{sum}($ word group $)+\operatorname{sum}($ faces group $)+\operatorname{sum}($ pictures group $)=20 \cdot 9.5+24 \cdot 12.1+19 \cdot 10.2=674.2$ mean $(X)=\operatorname{sum}(X) / n=674.2 / 63=10.70$
13. Find the sum of squares for the differences among groups ( $S S_{\text {treatment }}$ ).
$S S_{\text {treatment }}=\operatorname{sum}\left(\mathrm{n}_{\text {group }}(\mathrm{M}-\mathrm{Mbar})^{2}\right)=20 \cdot 1.2^{2}+24 \cdot 1.4^{2}+19 \cdot 5^{2}=80.59$
14. Find the residual sum of squares.

SS $_{\text {residual }}=$ SS (word group) + SS(faces group $)+$ SS(pictures group $)=205.7+231.2+211.8=648.7$
15. Convert both sums of squares to mean squares. The degrees of freedom are $d f_{\text {treatment }}=k-1=2$ and $d f_{\text {residual }}=\sum n_{i}-k=60$.
$\mathrm{MS}_{\text {treatment }}=80.59 / 2=40.30$
$\mathrm{MS}_{\text {residual }}=648.7 / 60=10.81$
16. Calculate the $F$ statistic for deciding whether the group means differ.
$F=40.30 / 10.81=3.73$
17. The critical value (with $\alpha=5 \%$ ) is 3.15 . What do you conclude? (Don't just write null or alternative.)

Average memory reliably differs depending on whether the material is words, faces, or pictures.

