## Data 621 Blog 2

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## Multiple Linear Regression

For my second blog I will continue to demonstrate a linear regression model by showing how to do a multiple linear regression model. A multiple linear regression model is a model that shows the relationship between an dependent variable, y, and one or more independent variables.

#### Load Dataset

I will be using the diamonds dataset again to show an example on how to create a multiple linear regression model. The diamond dataset is under the ggplot2 library.

```
library(ggplot2)
```

```
## Warning: package 'ggplot2' was built under R version 3.6.3
```

## Multiple Linear Regression Model

Use the lm model again to create the model.

```
model <- lm(price ~ carat + cut + color + clarity + depth + table + x + y + z, data = diamonds)
##
## lm(formula = price ~ carat + cut + color + clarity + depth +
##
        table + x + y + z, data = diamonds)
##
## Coefficients:
   (Intercept)
                                                                       cut.C
                                                                                       cut<sup>4</sup>
##
                                         cut.L
                                                        cut.Q
                         carat
##
       5753.762
                     11256.978
                                      584.457
                                                     -301.908
                                                                     148.035
                                                                                     -20.794
                                                      color<sup>4</sup>
##
        color.L
                     color.Q
                                      color.C
                                                                     color<sup>5</sup>
                                                                                     color<sup>6</sup>
##
     -1952.160
                      -672.054
                                     -165.283
                                                       38.195
                                                                     -95.793
                                                                                     -48.466
     clarity.L
                     clarity.Q
                                    clarity.C
                                                    clarity<sup>4</sup>
                                                                   clarity<sup>5</sup>
                                                                                  clarity<sup>6</sup>
##
##
      4097.431
                     -1925.004
                                      982.205
                                                     -364.918
                                                                     233.563
                                                                                       6.883
##
     clarity<sup>7</sup>
                         depth
                                         table
                                                                            у
##
         90.640
                       -63.806
                                       -26.474
                                                    -1008.261
                                                                       9.609
                                                                                     -50.119
```

Here we see a model created with every variable in the diamond dataset and their corresponding coefficients and intercepts displayed.

#### summary(model)

```
##
## Call:
## lm(formula = price ~ carat + cut + color + clarity + depth +
       table + x + y + z, data = diamonds)
##
##
## Residuals:
##
        Min
                  1Q
                        Median
                                     3Q
                                              Max
## -21376.0
              -592.4
                        -183.5
                                  376.4
                                         10694.2
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                5753.762
                             396.630
                                       14.507
                                                < 2e-16 ***
## carat
               11256.978
                              48.628
                                      231.494
                                                < 2e-16 ***
## cut.L
                 584.457
                              22.478
                                       26.001
                                                < 2e-16 ***
                -301.908
                              17.994
                                      -16.778
## cut.Q
                                                < 2e-16 ***
## cut.C
                 148.035
                              15.483
                                        9.561
                                                < 2e-16 ***
## cut^4
                 -20.794
                              12.377
                                       -1.680
                                                0.09294 .
## color.L
               -1952.160
                              17.342 -112.570
                                                < 2e-16 ***
## color.Q
                -672.054
                              15.777
                                      -42.597
                                                < 2e-16 ***
## color.C
                                      -11.225
                                                < 2e-16 ***
                -165.283
                              14.725
## color<sup>4</sup>
                  38.195
                              13.527
                                        2.824
                                               0.00475 **
## color^5
                 -95.793
                              12.776
                                       -7.498 6.59e-14 ***
## color^6
                                       -4.173 3.01e-05 ***
                 -48.466
                              11.614
## clarity.L
                4097.431
                              30.259
                                      135.414
                                                < 2e-16 ***
               -1925.004
                              28.227
                                      -68.197
                                                < 2e-16 ***
## clarity.Q
## clarity.C
                 982.205
                              24.152
                                       40.668
                                                < 2e-16 ***
                                      -18.922
                                                < 2e-16 ***
## clarity^4
                -364.918
                              19.285
## clarity^5
                 233.563
                                       14.828
                                                < 2e-16 ***
                              15.752
## clarity^6
                    6.883
                              13.715
                                        0.502 0.61575
## clarity^7
                  90.640
                              12.103
                                        7.489 7.06e-14 ***
## depth
                  -63.806
                               4.535
                                      -14.071
                                                < 2e-16 ***
## table
                               2.912
                                       -9.092
                                                < 2e-16 ***
                 -26.474
## x
               -1008.261
                              32.898
                                      -30.648
                                                < 2e-16 ***
## y
                   9.609
                              19.333
                                        0.497
                                                0.61918
## z
                  -50.119
                              33.486
                                       -1.497 0.13448
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 1130 on 53916 degrees of freedom
## Multiple R-squared: 0.9198, Adjusted R-squared: 0.9198
## F-statistic: 2.688e+04 on 23 and 53916 DF, p-value: < 2.2e-16
```

The summary function is once again used to show additional information of the model.

Let's create a model where we narrow down some of the variables. Let's create a model using price, carat, and depth.

```
model2 <- lm(price ~ carat + depth, data = diamonds)</pre>
model2
##
## Call:
## lm(formula = price ~ carat + depth, data = diamonds)
## Coefficients:
##
  (Intercept)
                                   depth
                      carat
##
        4045.3
                     7765.1
                                  -102.2
summary(model2)
##
## Call:
## lm(formula = price ~ carat + depth, data = diamonds)
##
## Residuals:
##
       Min
                  1Q
                       Median
                                    3Q
## -18238.9
              -801.6
                        -19.6
                                 546.3
                                       12683.7
##
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 4045.333
                           286.205
                                     14.13
                                             <2e-16 ***
## carat
               7765.141
                            14.009 554.28
                                             <2e-16 ***
                             4.635 -22.04
               -102.165
## depth
                                             <2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 1542 on 53937 degrees of freedom
## Multiple R-squared: 0.8507, Adjusted R-squared: 0.8507
## F-statistic: 1.536e+05 on 2 and 53937 DF, p-value: < 2.2e-16
```

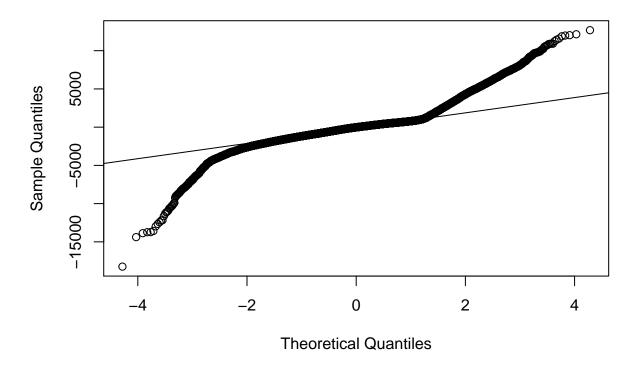
This is the information for the model created by the price, carat, and depth variables.

### Plot

Let's plot the residuals to check for normality. This is done by using the qqnorm and qqline functions.

```
qqnorm(model2$residuals)
qqline(model2$residuals)
```

# Normal Q-Q Plot



Here we see that a good amount of residuals follow the straight line, but there are a lot that deviate away from the line. We can say that the distribution is nearly normal. The model is an okay fit to the data, but there could be a model that is a better fit. This means that there is not really a strong relationship and having both carat and depth doesn't affect the price of a diamond too much.