# HW 12

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#### TO DO

The attached who.csv dataset contains real-world data from 2008. The variables included follow.

- Country: name of the country
- LifeExp: average life expectancy for the country in years
- InfantSurvival: proportion of those surviving to one year or more
- Under5Survival: proportion of those surviving to five years or more
- TBFree: proportion of the population without TB.
- PropMD: proportion of the population who are MDs
- PropRN: proportion of the population who are RNs
- PersExp: mean personal expenditures on healthcare in US dollars at average exchange rate
- GovtExp: mean government expenditures per capita on healthcare, US dollars at average exchange rate
- TotExp: sum of personal and government expenditures.

### library(tidyverse)

```
library(readr)
who <- read_csv("C:/Users/maria/Downloads/who.csv")

## Rows: 190 Columns: 10

## -- Column specification ------
## Delimiter: ","
## chr (1): Country
## dbl (9): LifeExp, InfantSurvival, Under5Survival, TBFree, PropMD, PropRN, Pe...

##
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.

View(who)
summary(who)</pre>
```

```
##
     Country
                        LifeExp
                                    InfantSurvival
                                                    Under5Survival
## Length:190
                     Min.
                            :40.00
                                    Min.
                                          :0.8350
                                                    Min.
                                                          :0.7310
## Class:character 1st Qu.:61.25
                                    1st Qu.:0.9433
                                                   1st Qu.:0.9253
## Mode :character Median :70.00
                                    Median: 0.9785 Median: 0.9745
```

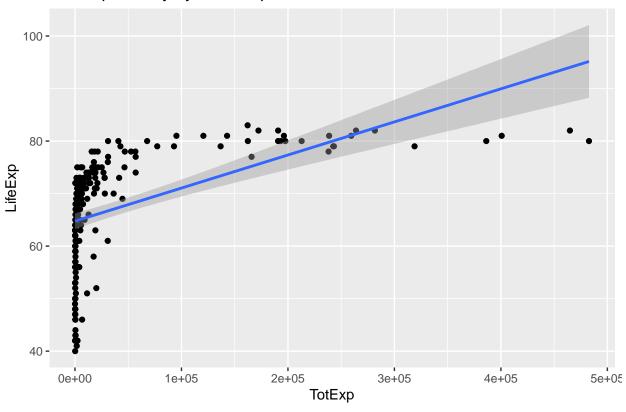
```
##
                        Mean
                               :67.38
                                         Mean
                                                 :0.9624
                                                           Mean
                                                                  :0.9459
##
                        3rd Qu.:75.00
                                         3rd Qu.:0.9910
                                                           3rd Qu.:0.9900
##
                        Max.
                               :83.00
                                         Max.
                                                :0.9980
                                                           Max.
                                                                  :0.9970
                          PropMD
##
        TBFree
                                               PropRN
                                                                   PersExp
##
    Min.
           :0.9870
                      Min.
                             :0.0000196
                                           Min.
                                                   :0.0000883
                                                                Min.
                                                                       :
                                                                            3.00
    1st Qu.:0.9969
                      1st Qu.:0.0002444
                                           1st Qu.:0.0008455
                                                                1st Qu.: 36.25
##
    Median :0.9992
                      Median :0.0010474
                                           Median :0.0027584
                                                                Median: 199.50
##
           :0.9980
                                                                        : 742.00
##
    Mean
                      Mean
                             :0.0017954
                                           Mean
                                                   :0.0041336
                                                                Mean
                      3rd Qu.:0.0024584
                                           3rd Qu.:0.0057164
##
    3rd Qu.:0.9998
                                                                3rd Qu.: 515.25
                             :0.0351290
                                                                        :6350.00
##
    Max.
           :1.0000
                      Max.
                                           Max.
                                                  :0.0708387
                                                                Max.
##
       GovtExp
                            TotExp
##
                10.0
                                     13
    Min.
                        Min.
##
    1st Qu.:
               559.5
                        1st Qu.:
                                    584
              5385.0
                        Median :
##
   Median :
                                  5541
##
    Mean
           : 40953.5
                               : 41696
                        Mean
##
    3rd Qu.: 25680.2
                        3rd Qu.: 26331
    Max.
           :476420.0
                               :482750
                        Max.
```

### Part 1

Provide a scatterplot of LifeExp~TotExp, and run simple linear regression. Do not transform the variables. Provide and interpret the F statistics, R^2, standard error, and p-values only. Discuss whether the assumptions of simple linear regression met.

```
who %>%
   ggplot(aes(x=TotExp, y=LifeExp)) +
   geom_point() +
   labs(title = 'Life Expectancy by Total Expenditures') + geom_smooth(method='lm', formula= y~x)
```

## Life Expectancy by Total Expenditures



```
# Simple linear regression
simple_lm <- lm(LifeExp ~ TotExp, data=who)
summary(simple_lm)</pre>
```

```
##
## lm(formula = LifeExp ~ TotExp, data = who)
##
## Residuals:
##
      Min
               1Q Median
                               3Q
                                      Max
## -24.764 -4.778
                    3.154
                            7.116 13.292
##
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 6.475e+01 7.535e-01 85.933 < 2e-16 ***
              6.297e-05 7.795e-06
                                     8.079 7.71e-14 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Residual standard error: 9.371 on 188 degrees of freedom
## Multiple R-squared: 0.2577, Adjusted R-squared: 0.2537
## F-statistic: 65.26 on 1 and 188 DF, p-value: 7.714e-14
```

• F statistic: Not useful given this is a single parameter model

- R^2: Multiple R-squared is 0.2577, indicating the model explains 25.77% of the data's variation. We need at least 50% to consider this model a good fit for the data.
- Adjusted R-squared not important because of the single variable regression model.
- Standard error: Using the t-values to interpret the standard errors, the standard error for the intercept is quite small indicating little variability in the intercept value. The t-value for Total Expenditure is over 8, which according to the textbook is good. however, we need more information to determine if these values are misleading.
- p-values: Both p-values are quite small, indicating the probability of the coefficients as not relevant to the model.

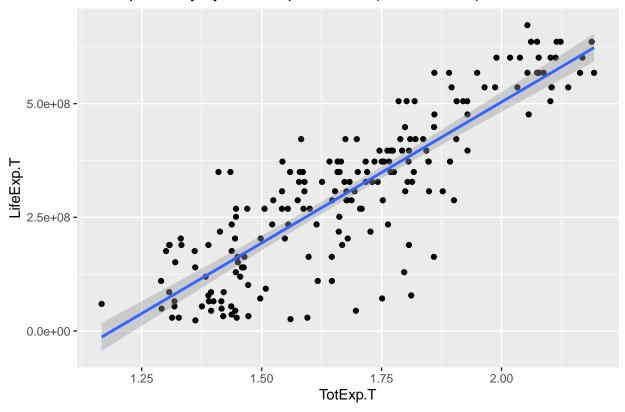
As mentioned in Standard Error, according to the textbook, these values represent a good model, yet the model plots and R-squared value indicate otherwise.

### Part 2

Raise life expectancy to the 4.6 power (i.e., LifeExp^4.6). Raise total expenditures to the 0.06 power (nearly a log transform, TotExp^.06). Plot LifeExp^4.6 as a function of TotExp^.06, and re-run the simple regression model using the transformed variables. Provide and interpret the F statistics, R^2, standard error, and p-values. Which model is "better?"

```
# variables transformed
who$LifeExp.T <- who$LifeExp^4.6
who$TotExp.T <- who$TotExp^.06
who %>%
    ggplot(aes(x=TotExp.T, y=LifeExp.T)) +
    geom_point() +
    labs(title = 'Life Expectancy by Total Expenditures (Transformed)') + geom_smooth(method='lm', formul)
```

# Life Expectancy by Total Expenditures (Transformed)



```
# simple model of variables transformed
simple_t_lm <- lm(LifeExp.T ~ TotExp.T, data=who)
summary(simple_t_lm)</pre>
```

```
##
## Call:
## lm(formula = LifeExp.T ~ TotExp.T, data = who)
##
## Residuals:
##
         Min
                      1Q
                             Median
                                            3Q
                                                      Max
  -308616089 -53978977
                           13697187
                                      59139231 211951764
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) -736527910
                           46817945
                                    -15.73
## TotExp.T
                620060216
                            27518940
                                       22.53
                                               <2e-16 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Residual standard error: 90490000 on 188 degrees of freedom
## Multiple R-squared: 0.7298, Adjusted R-squared: 0.7283
## F-statistic: 507.7 on 1 and 188 DF, p-value: < 2.2e-16
```

• F statistic: not useful given this is a single parameter model

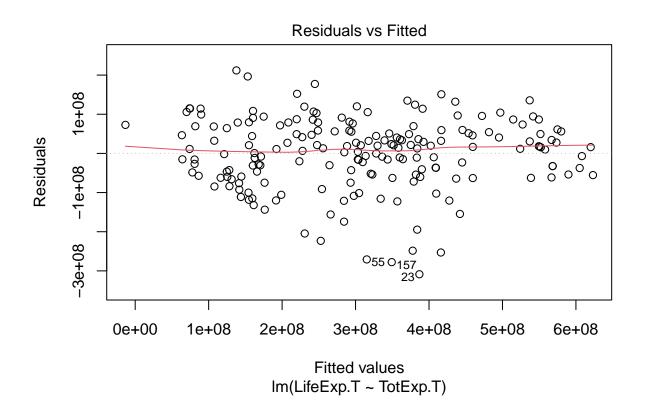
- R^2: Multiple R-squared is 0.7298, indicating the model explains 72.98% of the data's variation. We could say this is quite an improvement compared to the first model.
- Adjusted R-squared not important because of the single variable regression model.
- Standard error: Using the t-values to interpret the standard errors, the standard error for the intercept shows a ratio greater than 15 when comparing the standard error the coefficient, indicating little variability in the intercept value.

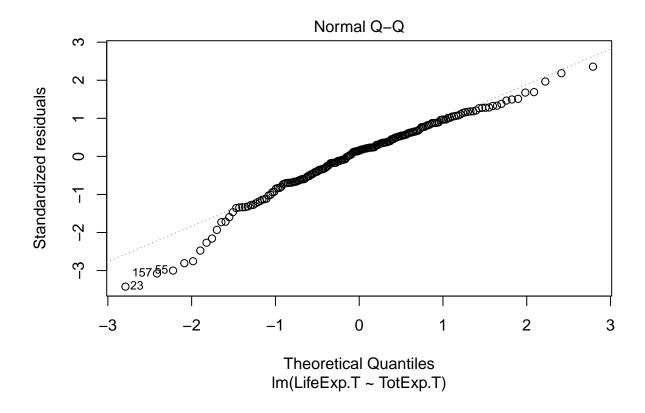
The t-value for Total Expenditure is over 22, which according to the textbook is good. Both standard error values as compared to the coefficient values are indicative of a good model because both denote little variability in the coefficient values.

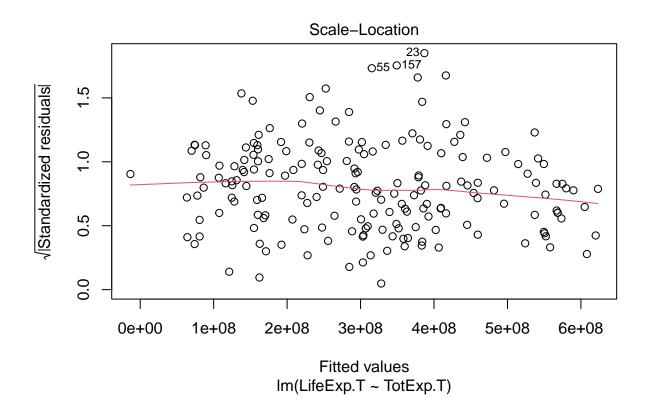
• p-values: The p-value for the intercept and Total Expenditure coefficients are very small which means the chance the coefficient value is not relevant to the model is very, very infrequent. For both values, good sign the model is valid for the dataset.

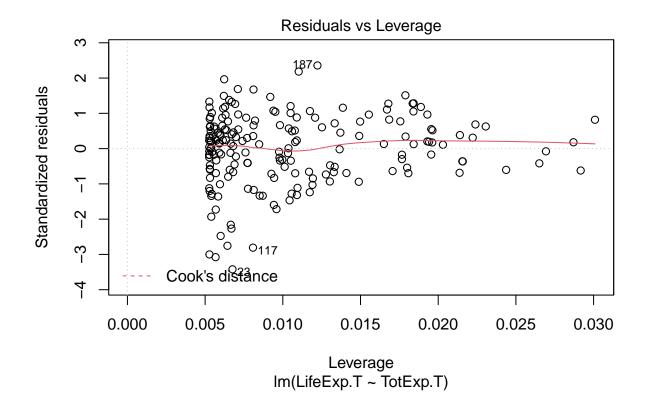
The model with transformed values (second model) is better. Scatterplot above and Residuals vs Fitted plot below confirm this assessment.

plot(simple\_t\_lm)









### Part 3

Using the results from 3, forecast life expectancy when  $TotExp^{\circ}.06 = 1.5$ . Then forecast life expectancy when  $TotExp^{\circ}.06 = 2.5$ .

```
result_3.1 <- simple_t_lm$coefficients[[1]] + (1.5 * simple_t_lm$coefficients[[2]])
result_3.1 <- result_3.1^(1/4.6)
result_3.1</pre>
```

## [1] 63.31153

### Part 4

Build the following multiple regression model and interpret the F Statistics, R<sup>2</sup>, standard error, and p-values. How good is the model?

```
\label{eq:lifeExp} \text{LifeExp} = \text{b0} + (\text{b1} \text{ x PropMd}) + (\text{b2} \text{ x TotExp}) + \text{b3} \text{ x PropMD x TotExp}
```

```
mult_lm <- lm(LifeExp ~ PropMD + TotExp + (PropMD * TotExp), data=who)
summary(mult_lm)</pre>
```

## ## Call:

```
## lm(formula = LifeExp ~ PropMD + TotExp + (PropMD * TotExp), data = who)
##
## Residuals:
##
       Min
                                3Q
                1Q
                    Median
                                       Max
##
   -27.320
            -4.132
                     2.098
                             6.540
                                    13.074
##
## Coefficients:
##
                   Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                  6.277e+01
                             7.956e-01
                                        78.899
                                                < 2e-16 ***
## PropMD
                  1.497e+03
                             2.788e+02
                                          5.371 2.32e-07 ***
                  7.233e-05
## TotExp
                             8.982e-06
                                         8.053 9.39e-14 ***
## PropMD:TotExp -6.026e-03
                             1.472e-03
                                        -4.093 6.35e-05 ***
                  0 '*** 0.001 '** 0.01 '* 0.05 '. ' 0.1 ' ' 1
## Signif. codes:
##
## Residual standard error: 8.765 on 186 degrees of freedom
## Multiple R-squared: 0.3574, Adjusted R-squared: 0.3471
## F-statistic: 34.49 on 3 and 186 DF, p-value: < 2.2e-16
```

- F statistic: The model results in a value of 34.49 on 3 and 186 degrees of freedom. According to the textbook, "the F-test compares the current model to a model with one fewer predictor. If the current model is better than the reduced model, the p-value will be small." Given the p-value is quite small, this model would be better than a reduced model.
- R^2: The multiple R-squared value is 0.3574, and the adjusted R-squared is 0.3471. In assessing the model, these two values are not indicative of a good model. These results show the model accounts for only 35% of the variation in the data.

As points of comparison to the first two models, this multiple regression model performs better than the first simple linear regression model, but much worse than the transformed simple linear regression model.

• p-values: The p-values for all 4 coefficients are quite small, typically a sign of a good model.

### Part 5

Forecast LifeExp when PropMD=.03 and TotExp = 14. Does this forecast seem realistic? Why or why not?

## Pending