<u>Regression Analysis on Life Expectancy – Further Study</u>

Brief Background:

- (i) Initially, dataset had 2938 observations for 193 countries on 22 variables from the year 2000-2015.
- (ii) Removal of Missing observations by mean of each variables for each country and then dropping the observations for which missing values still existed.
- (iii)Created subset of the dataset for the variables Percentage Expenditure, Total Expenditure, Population, GDP, Income
- (iv) Carried out analysis on **full** dataset **2128** observation for **133** countries on **6** variables.

Dependent Variable: Life Expectancy

Independent Variable: Percentage Expenditure (PE), Total Expenditure (TE), Population (Popl), GDP, Income (I)

Brief Observations:

- (i) Life Expectancy has significant correlation with GDP and Income.
- (ii) GDP and PE has high correlation about 0.934.

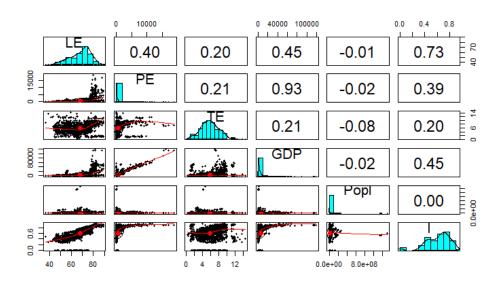


Figure 1- Correlation Plot of all variables

Model Fitting:

- Linear Model on all the variables. Observations:
 - (i) Population is insignificant
 - (ii) Adjusted $R^2 = 55.56$
 - (iii) MSE = 41.0426

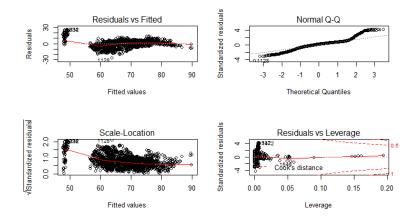


Figure 2- Linear Model Plot

Assumptions:

- (i) Homogeneity of Variance seems to hold
- (ii) Normality Violated
- Check for Multicollinearity VIF values: PE = **7.9**, TE = 1.07, GDP = **8.5**, Population = 1.0068, Income = 1.29
- 1. Model 1 **Removed high VIF variables** (PE and GDP)

Observations:

- (i) Population becomes insignificant
- (ii) Adjusted $R^2 = 54.21$
- (iii) MSE = 42.29
- 2. Model 1_1 Removed variable Population

Observations:

- (i) Model: LE = 45.87 + 0.26TE + 34.122I
- (ii) Adjusted $R^2 = 54.23$
- (iii) MSE = 42.27
- (iv) R^2 predicted = 0.54

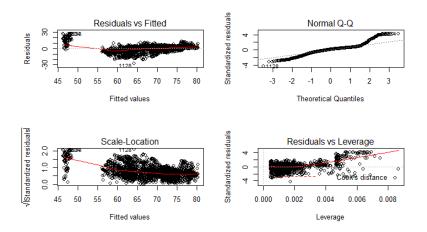


Figure 3- Model 1_1 Plot

3. Model 2 - Ridge Regression

Observations:

- (i) PE, Population insignificant
- (ii) Model: LE = 1.876e-1 + 1.133e-4*GDP + 3.136e01*I
- (iii) Ridge Parameter = 0.001355

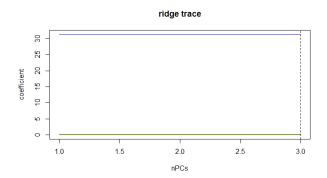


Figure 4 - Ridge Plot

4. Model 4 - Stepwise Regression

Observations:

- (i) AIC = 7907.1
- (ii) Model: LE = 4.735e1 + 1.873e-1*TE + 1.131e-4*GDP + 3.141e1*I
- (iii) Adjusted $R^2 = 0.556$ (highest among all models)
- (iv)MSE = **41.011** (least among all models)
- (v) No further multicollinearity problem
- $(vi)R^2$ predicted = 55.38%

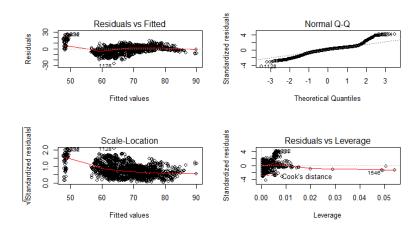


Figure 5 - Step wise Model Plot

- Final Model Model obtained from Stepwise Regression
 - (i) Checking of assumption of final model Normality assumption is **violated** from graph and from Shapiro test, p value << 0.05.

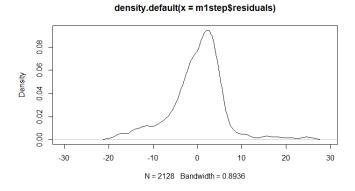


Figure 6- Residual Density Plot

(ii) Multiple Influence Observations present from Cook's Distance plot.

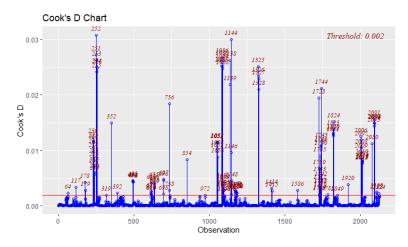


Figure 7 - Cook's D chart

Further Study:

- (i) Transformation required for the model to hold Normality Assumption.
- (ii) Remove Influence observations and observe the new model.
- (iii) Carry out Partial Regression to observe how the independent variables have effect on Life Expectancy.