- The index of the outliers removed: 365, 369, 370, 372, 373, 381, 406, 411, 415, 419.
- Following is a box-cox plot of the lambda parameter and its log-likelihood. The <u>best lambda</u> is around **0.182**.

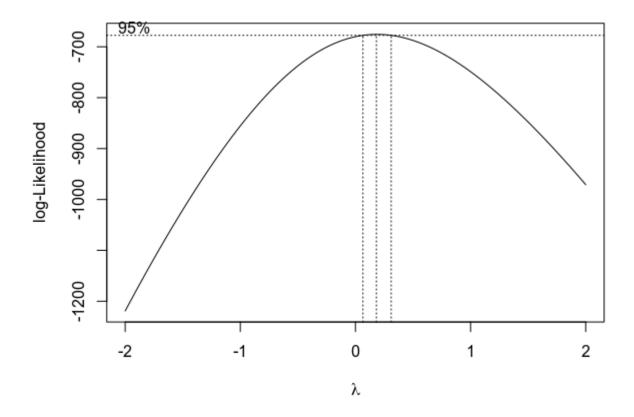


Figure 1: The log-likelihood vs. parameter of box-cox transformation.

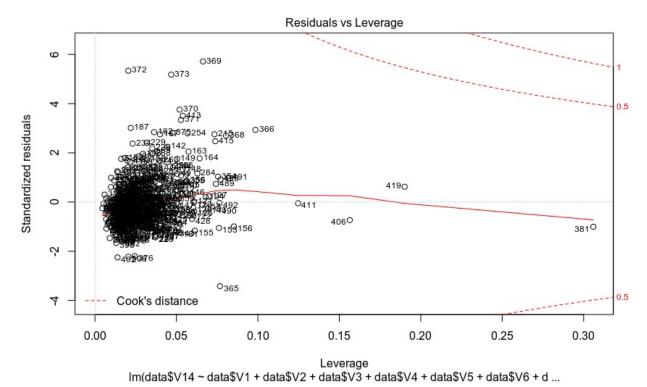


Figure 2: Standardized Residual vs. Leverage vs. Cook's Distance plot with outliers.

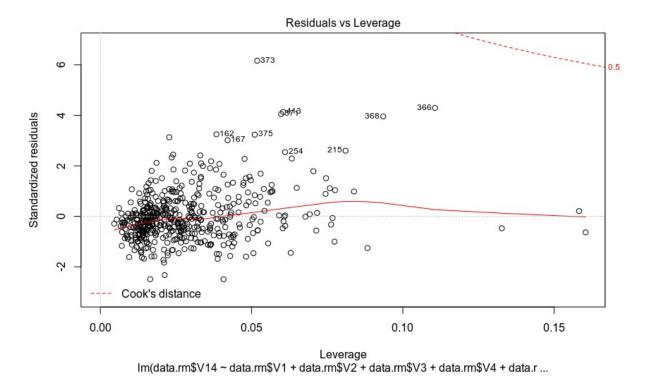


Figure 3: Standardized Residual vs. Leverage vs. Cook's Distance plot without outliers.

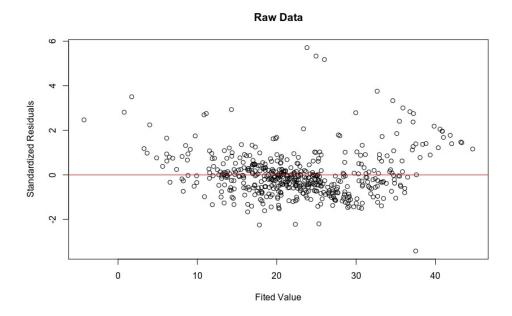


Figure 4: Standardized Residual vs. Fitted Values without transformation

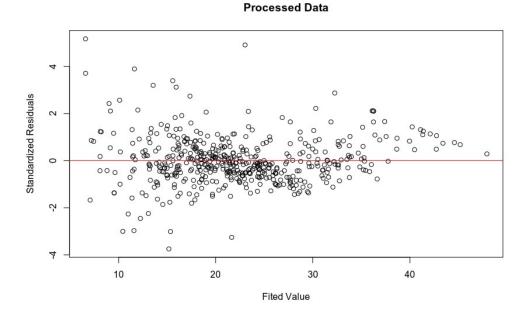


Figure 5: Std Residual vs. Fitted Values with 10 outliers removed & transforming the dependent variable

Comparing the above two graphs, we can observe that with transformation, the linear regression can yield results with standardized residuals that are closely center to o compared to the result generated by using original data.

Fitted vs True House Price

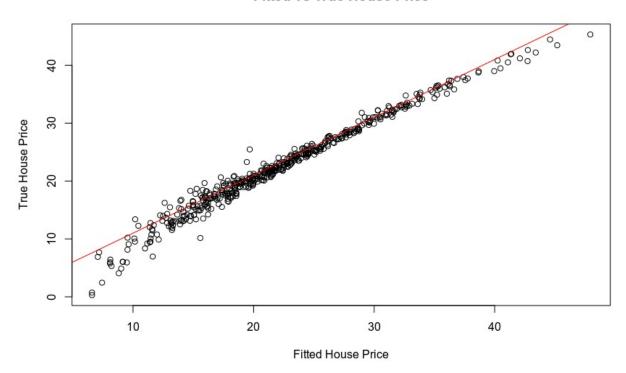


Figure 6: The plot of fitted house price vs true house price

From the above graph, we can observe that the plot of fitted house price vs true house price follows closely as the line of y=x. This indicates that our linear regression has yielded desirable result.

```
setwd('~/Documents/Applied-Machine-Learning/HW-7/')
  library(MASS)
  data <- read.table('housing data.txt', header = FALSE)</pre>
 data.lm <-
 lm(data\$V14-data\$V1+data\$V2+data\$V3+data\$V4+data\$V5+data\$V6+data\$V7+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data\$V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+data§V8+
  $V9+data$V10+data$V11+data$V12+data$V13, data = data)
 par(c(0, 0, 2, 0))
 plot(data.lm, id.n = 506) # Use this line to show all the indices of all the
 sum = summary(data.lm)
 data.rm <-data[-c(365, 369, 370, 372, 373, 381, 406, 411, 415, 419),]
 data.rm.lm <-
 \\ lm(data.rm\$V14~data.rm\$V1+data.rm\$V2+data.rm\$V3+data.rm\$V4+data.rm\$V5+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm\$V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+data.rm*V6+dat
 +data.rm$V7+data.rm$V8+data.rm$V9+data.rm$V10+data.rm$V11+data.rm$V12+data.rm$V1
 3. data = data.rm)
  plot(data.rm.lm, id.n = 10)
 box cox result <- boxcox(data.rm.lm)</pre>
 best_lam <- box_cox_result$x[which(box_cox_result$y == max(box_cox_result$y))]</pre>
 data.box <- (data.rm$V14^best lam-1)/best lam
 box.lm <-
 lm(data.box~data.rm$V1+data.rm$V2+data.rm$V3+data.rm$V4+data.rm$V5+data.rm$V6+da
 ta.rm$V7+data.rm$V8+data.rm$V9+data.rm$V10+data.rm$V11+data.rm$V12+data.rm$V13,
 data = data.rm)
data.stdres = rstandard(data.lm)
plot(data.lm$fitted.values, data.stdres, ylab="Standardized Residuals",
xlab="Fited Value", main="Raw Data")
abline(0, 0, col='red')
box.stdres = rstandard(box.lm)
box.lm.fitted retrans = (box.lm$fitted.values*best lam+1)^(1./best lam)
plot(box.lm.fitted_retrans, box.stdres, ylab="Standardized Residuals",
xlab="Fited Value", main="Processed Data")
abline(0, 0, col='red')
plot(box.lm.fitted_retrans, data.rm.lm$fitted.values, ylab="True House Price",
xlab="Fitted House Price", main="Fitted vs True House Price")
abline(1, 1, col='red')
```