

Construcción de modelo estadístico

Héctor Francisco Marín Garrido

2022-09-08

Empezamos cargando los datos y comenzando con un análisis de correlación para ver qué factores son los que más afectan a la concentración de mercurio en los lagos. Para esto se retiraron variables categóricas y no numéricas, de igual manera se hizo el análisis de la correlación con la concentración mínima, máxima y la promedio de mercurio en grupos de peces.

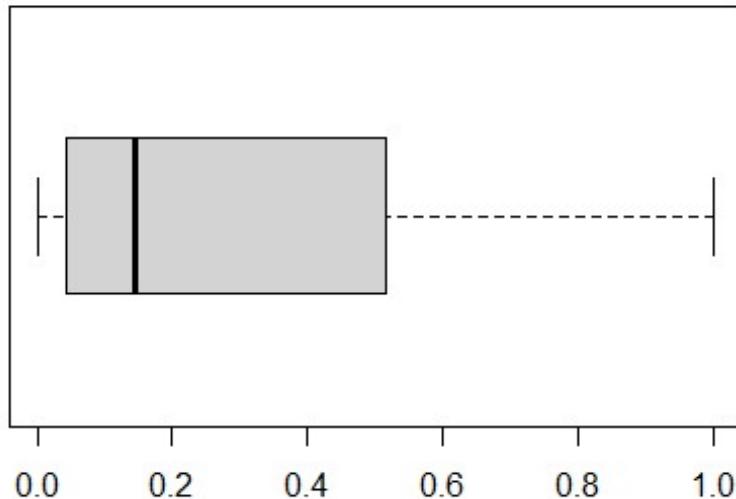
```
M=read.csv("D:\\AI_ITESM\\mercurio.csv")
M=M
Mtest=M[c("X3","X4","X5","X6","X8","X7","X9","X10","X11")]
min_max_norm<-function(x){(x-min(x))/(max(x)-min(x))}
M1=as.data.frame(lapply(Mtest,min_max_norm))
cor(Mtest)

##          X3          X4          X5          X6          X8
X7  1.0000000  0.71916568  0.83260419  0.47753085  0.01029074 -
0.59389671
## X4  0.71916568  1.00000000  0.57713272  0.60848276 -0.01860607 -
0.57540012
## X5  0.83260419  0.57713272  1.00000000  0.40991385 -0.08937901 -
0.40067958
## X6  0.47753085  0.60848276  0.40991385  1.00000000 -0.01182027 -
0.49137481
## X8  0.01029074 -0.01860607 -0.08937901 -0.01182027  1.00000000
0.07903426
## X7 -0.59389671 -0.57540012 -0.40067958 -0.49137481  0.07903426
1.00000000
## X9 -0.52535654 -0.54196524 -0.33247623 -0.40045856 -0.08165278
0.92720506
## X10 -0.60479558 -0.55181523 -0.40791663 -0.48497215  0.16109174
0.91586397
## X11 -0.62795845 -0.61284905 -0.46440947 -0.50644193  0.02580046
0.95921481
##          X9          X10          X11
## X3 -0.52535654 -0.6047956 -0.62795845
## X4 -0.54196524 -0.5518152 -0.61284905
## X5 -0.33247623 -0.4079166 -0.46440947
## X6 -0.40045856 -0.4849721 -0.50644193
## X8 -0.08165278  0.1610917  0.02580046
## X7  0.92720506  0.9158640  0.95921481
## X9  1.00000000  0.7653532  0.91908939
```

```
## X10  0.76535319  1.0000000  0.85975810  
## X11  0.91908939  0.8597581  1.00000000
```

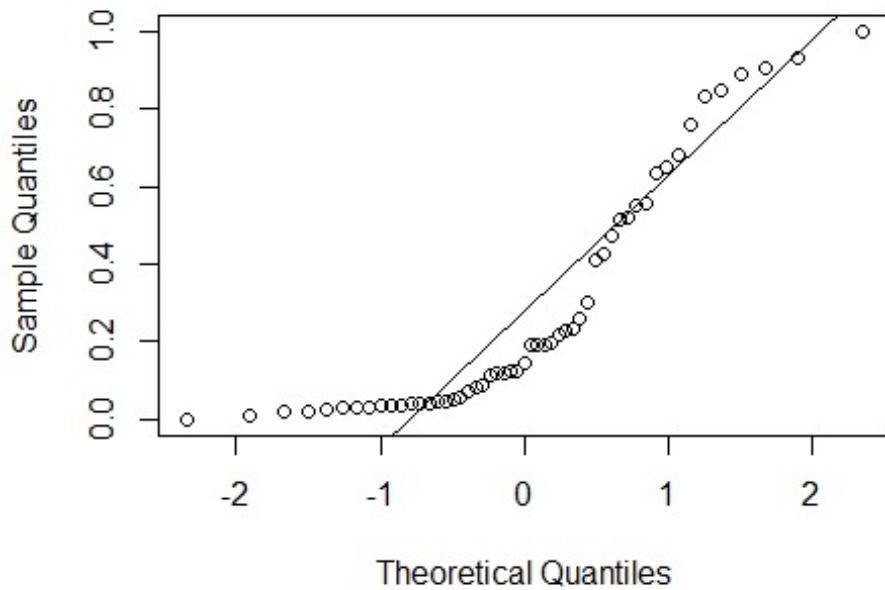
Ahora procedemos a analizar la distribucion de los datos y los intervalos de confianza de todas las variables cuantitativas en nuestra base de datos.

```
q1=quantile(M1$X3,0.25) #Cuartil 1 de la variable X  
q2=quantile(M1$X3,0.5)  
q3=quantile(M1$X3,0.75)  
y1=min(M1$X3)  
y2=max(M1$X3)  
ri=IQR(M1$X3)  
boxplot(M1$X3, horizontal=TRUE, ylim=c(y1,y2))  
abline(v=q3+1.5*ri, col="red")
```



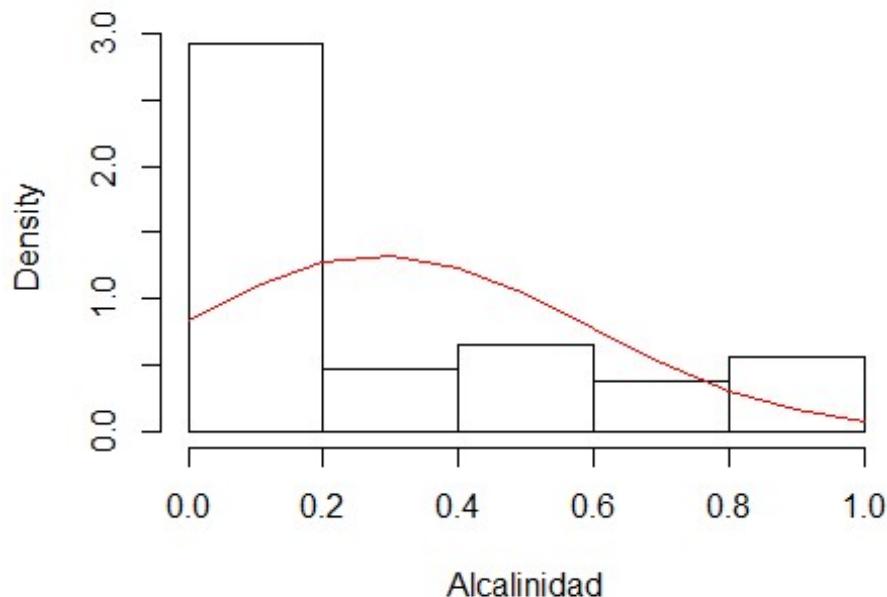
```
Alcalinidad= M1[M1$X3<q3+1.5*ri,c("X3")]  
qqnorm(Alcalinidad)  
qqline(Alcalinidad)
```

Normal Q-Q Plot



```
hist(Alcalinidad,prob=TRUE,col=0)
x=seq(min(Alcalinidad),max(Alcalinidad),0.1)
y=dnorm(x,mean(Alcalinidad),sd(Alcalinidad))
lines(x,y,col="red")
```

Histogram of Alcalinidad



```
library(moments)

## Warning: package 'moments' was built under R version 4.1.3

skewness1=skewness(Alcalinidad)
cat("Sesgo: ",skewness1)

## Sesgo:  0.9959715

cat("\n")

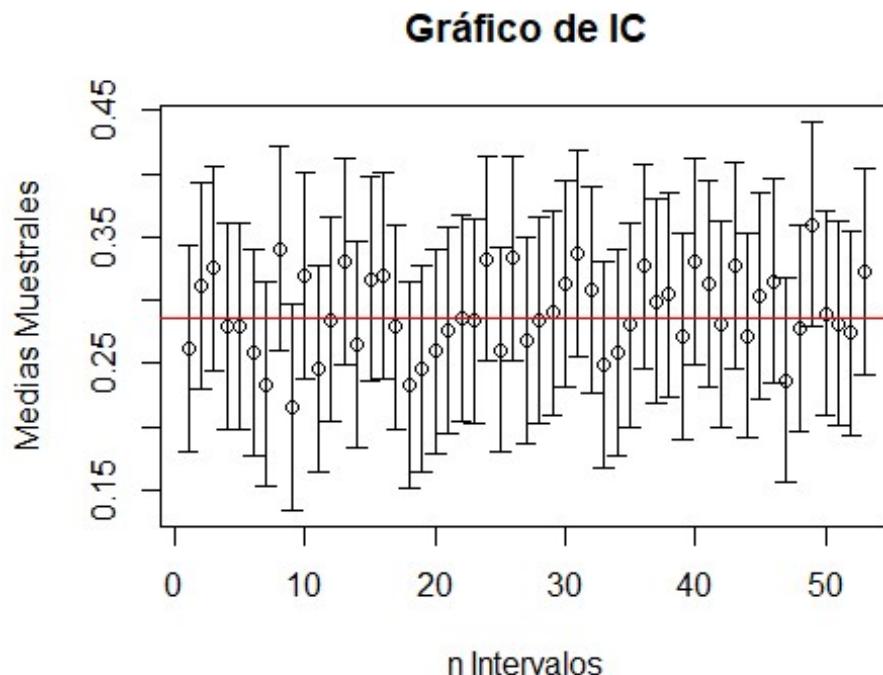
kurtosis1=kurtosis(Alcalinidad)
cat("Curtosis: ",kurtosis1)

## Curtosis:  2.627688

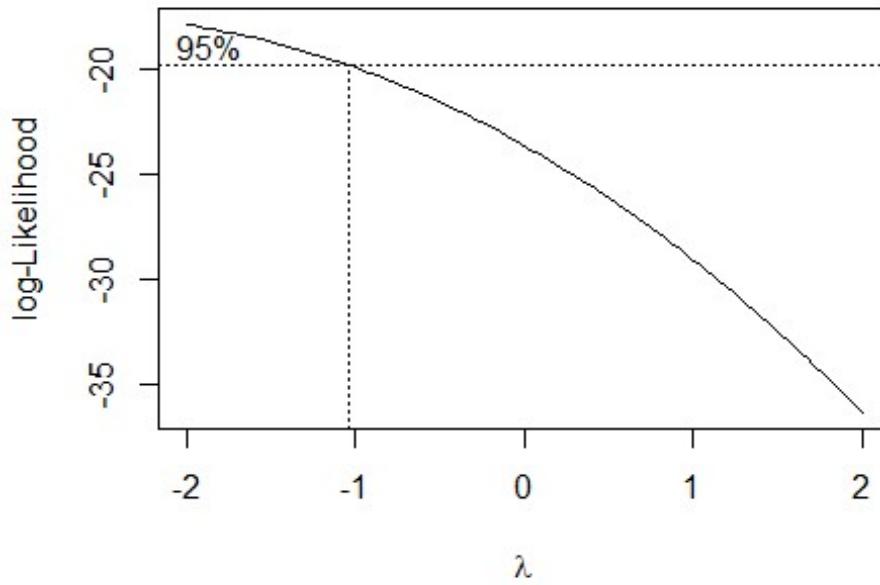
cat("\n")

library(plotrix)
n=length(Alcalinidad)
media=mean(Alcalinidad)
DE=sd(Alcalinidad)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias")
```

```
Muestrales")
abline(h=media,col="red")
```



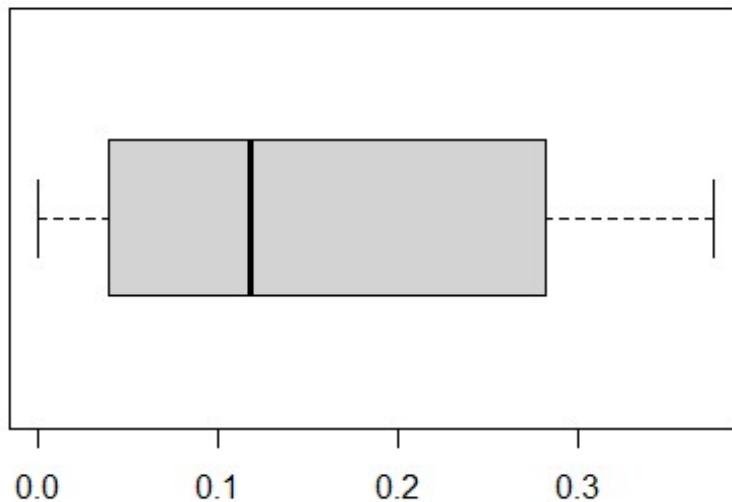
```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de:  0.2865157  +-  0.08111373
library(MASS)
minim=min(M1$X3)
b <- boxcox(lm((M1$X3+1) ~ 1))
```



```

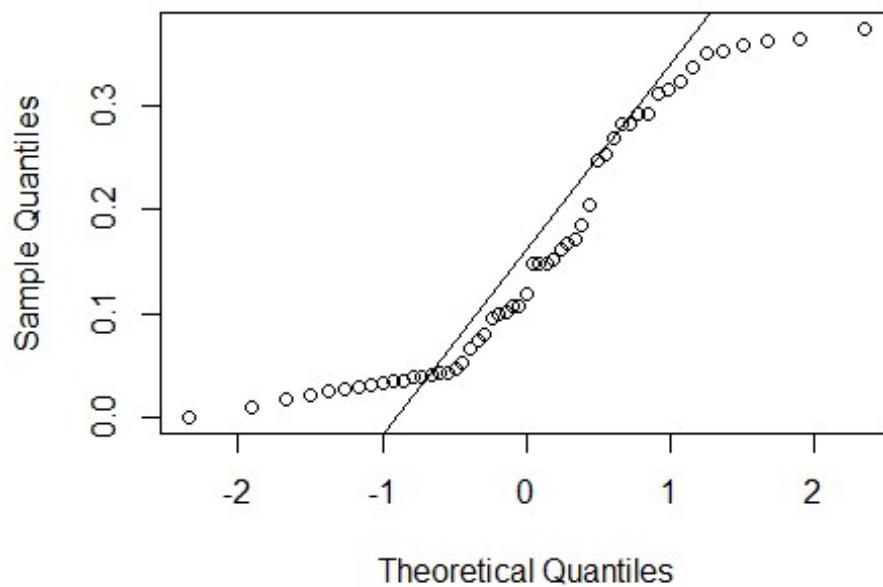
lambda <- b$x[which.max(b$y)]
X3<-(M1$X3+1)^lambda-1)/lambda
q1=quantile(X3,0.25) #Cuantil 1 de la variable X
q2=quantile(X3,0.5)
q3=quantile(X3,0.75)
y1=min(X3)
y2=max(X3)
ri=IQR(X3)
boxplot(X3, horizontal=TRUE, ylim=c(y1,y2))
abline(v=q3+1.5*ri, col="red")

```



```
AlcalinidadBC = X3  
qqnorm(AlcalinidadBC)  
qqline(AlcalinidadBC)
```

Normal Q-Q Plot

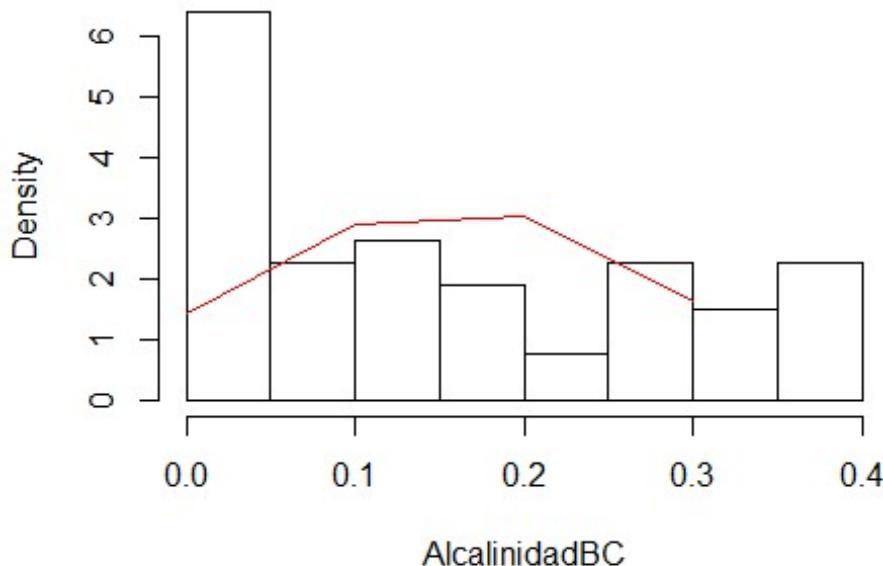


```

hist(AlcalinidadBC,prob=TRUE,col=0)
x=seq(min(AlcalinidadBC),max(AlcalinidadBC),0.1)
y=dnorm(x,mean(AlcalinidadBC),sd(AlcalinidadBC))
lines(x,y,col="red")

```

Histogram of AlcalinidadBC



```

library(moments)
skewness1=skewness(AlcalinidadBC)
cat("Sesgo: ",skewness1)

## Sesgo:  0.4590799

cat("\n")

kurtosis1=kurtosis(AlcalinidadBC)
cat("Curtosis: ",kurtosis1)

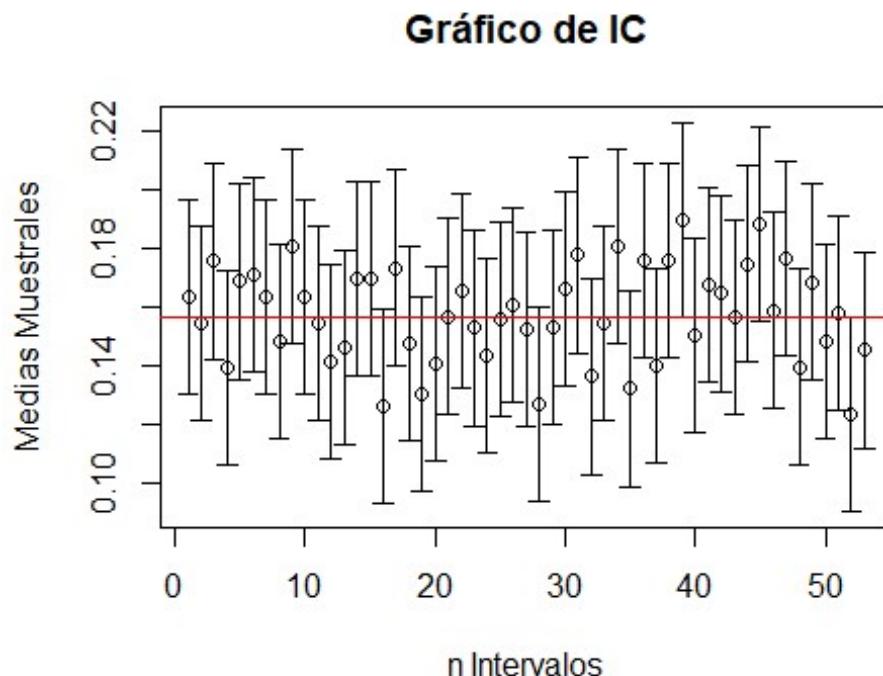
## Curtosis:  1.723831

cat("\n")

library(plotrix)
n=length(AlcalinidadBC)
media=mean(AlcalinidadBC)
DE=sd(AlcalinidadBC)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)

```

```
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias Muestrales")
abline(h=media,col="red")
```



```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de:  0.1562331  +-  0.03316211
cor.test(M1$X7,M1$X3)

##
## Pearson's product-moment correlation
##
## data:  M1$X7 and M1$X3
## t = -5.2717, df = 51, p-value = 2.763e-06
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.7446538 -0.3854832
## sample estimates:
##      cor
## -0.5938967

regresion=lm(M1$X7 ~ M1$X3)
regresion

##
## Call:
## lm(formula = M1$X7 ~ M1$X3)
```

```

##  

## Coefficients:  

## (Intercept)      M1$X3  

##       0.5270     -0.5211  

PH=summary(regresion)  

PH  

##  

## Call:  

## lm(formula = M1$X7 ~ M1$X3)  

##  

## Residuals:  

##      Min       1Q   Median       3Q      Max  

## -0.31898 -0.13925 -0.05769  0.08473  0.64983  

##  

## Coefficients:  

##              Estimate Std. Error t value Pr(>|t|)  

## (Intercept)  0.52696   0.04090 12.885 < 2e-16 ***  

## M1$X3       -0.52112   0.09885 -5.272 2.76e-06 ***  

## ---  

## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1  

##  

## Residual standard error: 0.2148 on 51 degrees of freedom  

## Multiple R-squared:  0.3527, Adjusted R-squared:  0.34  

## F-statistic: 27.79 on 1 and 51 DF,  p-value: 2.763e-06  

plot(M1$X3,M1$X7,col="blue",xlab="Alcalinidad",ylab="Concentracion de  

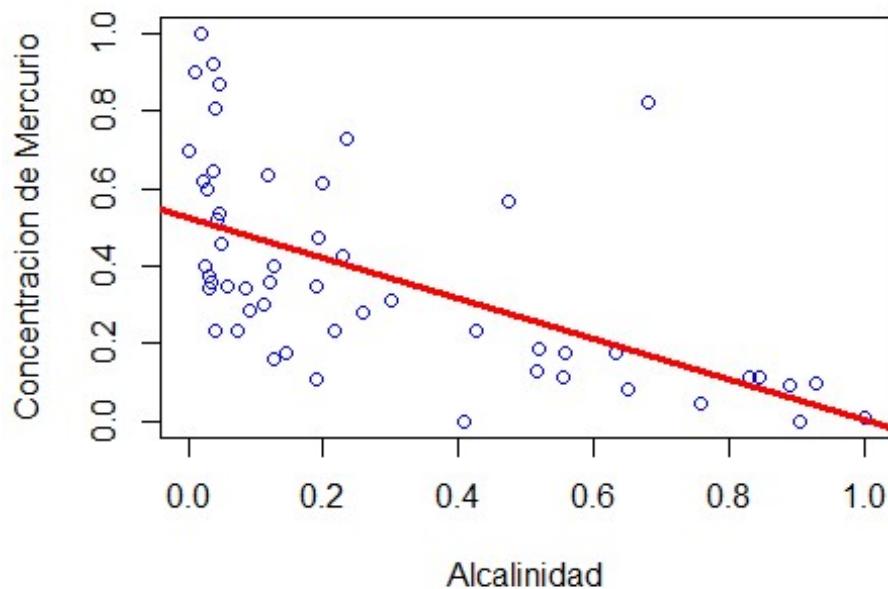
Mercurio",main="Alcalinidad vs. Concentracion de Mercurio")  

abline(regresion,col="red",lwd=3)  

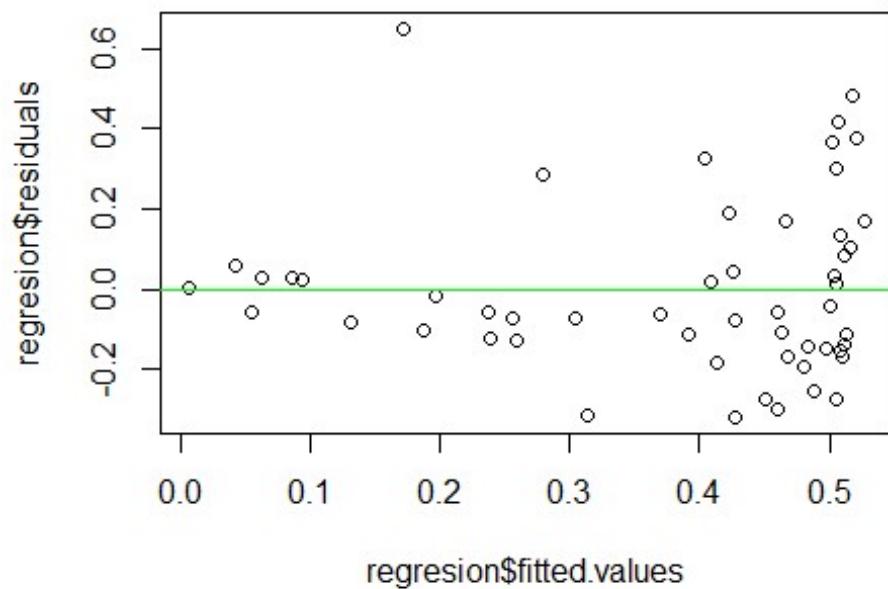
text(80,1.2,"B1=-0.005302 B0=0.726140")

```

Alcalinidad vs. Concentracion de Mercurio



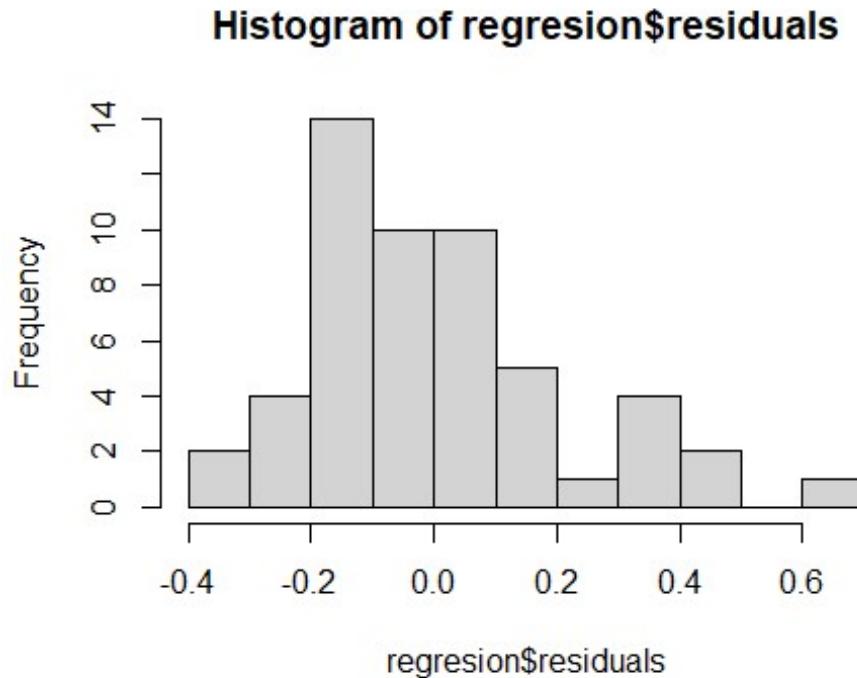
```
plot(regresion$fitted.values, regresion$residuals)
abline(h=0,col="green")
```



```
shapiro.test(regresion$residuals)

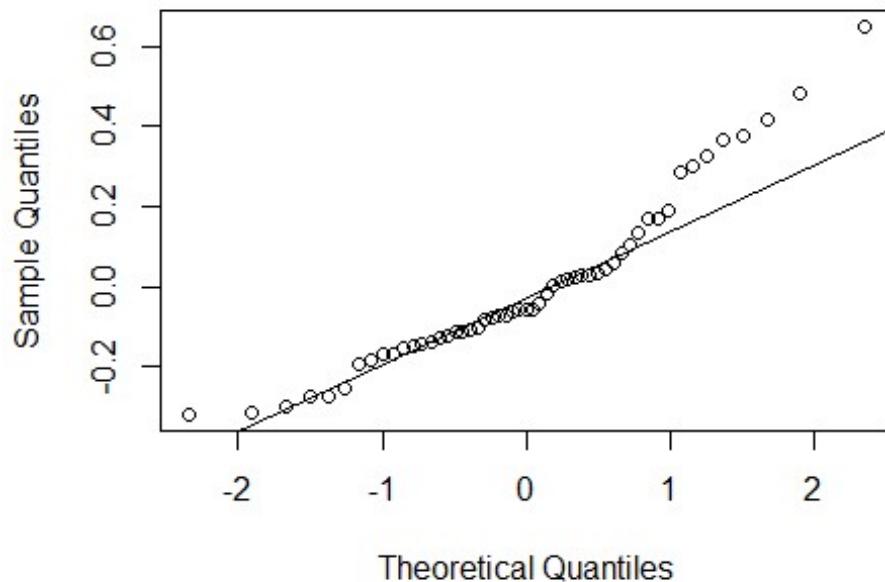
##
##  Shapiro-Wilk normality test
##
## data: regresion$residuals
## W = 0.9295, p-value = 0.003866

hist(regresion$residuals)
```



```
qqnorm(regresion$residuals)
qqline(regresion$residuals)
```

Normal Q-Q Plot



```
t.test(regresion$residuals)

##
##  One Sample t-test
##
##  data: regresion$residuals
##  t = 1.2507e-16, df = 52, p-value = 1
##  alternative hypothesis: true mean is not equal to 0
##  95 percent confidence interval:
##  -0.05862615  0.05862615
##  sample estimates:
##  mean of x
##  3.65394e-18

cor.test(M1$X7,AlcalinidadBC)

##
##  Pearson's product-moment correlation
##
##  data: M1$X7 and AlcalinidadBC
##  t = -5.6648, df = 51, p-value = 6.838e-07
##  alternative hypothesis: true correlation is not equal to 0
##  95 percent confidence interval:
##  -0.7635021 -0.4220611
##  sample estimates:
##  cor
##  -0.6214586
```

```

regresion=lm(M1$X7 ~ AlcalinidadBC)
regresion

##
## Call:
## lm(formula = M1$X7 ~ AlcalinidadBC)
##
## Coefficients:
##   (Intercept)  AlcalinidadBC
##             0.586          -1.334

PH=summary(regresion)
PH

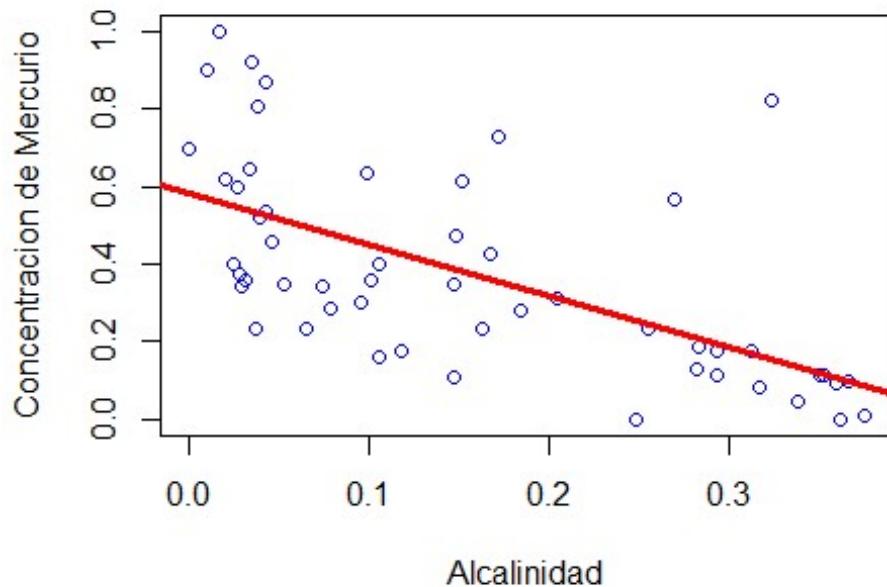
##
## Call:
## lm(formula = M1$X7 ~ AlcalinidadBC)
##
## Residuals:
##       Min      1Q  Median      3Q     Max
## -0.30290 -0.14602 -0.02215  0.06435  0.66667
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)
## (Intercept)  0.58603   0.04667 12.556 < 2e-16 ***
## AlcalinidadBC -1.33380   0.23545 -5.665 6.84e-07 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

##
## Residual standard error: 0.2091 on 51 degrees of freedom
## Multiple R-squared:  0.3862, Adjusted R-squared:  0.3742
## F-statistic: 32.09 on 1 and 51 DF,  p-value: 6.838e-07

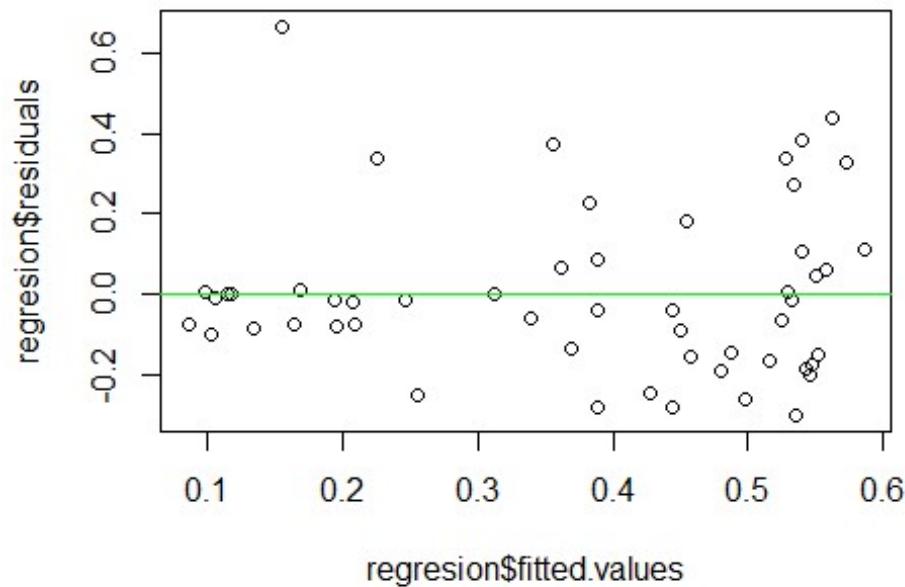
plot(AlcalinidadBC,M1$X7,col="blue",xlab="Alcalinidad",ylab="Concentracion de Mercurio",main="Alcalinidad Box-Cox vs. Concentracion de Mercurio")
abline(regresion,col="red",lwd=3)
text(80,1.2,"B1=-0.005302 B0=0.726140")

```

Alcalinidad Box-Cox vs. Concentracion de Mercurio



```
plot(regresion$fitted.values, regresion$residuals)
abline(h=0,col="green")
```

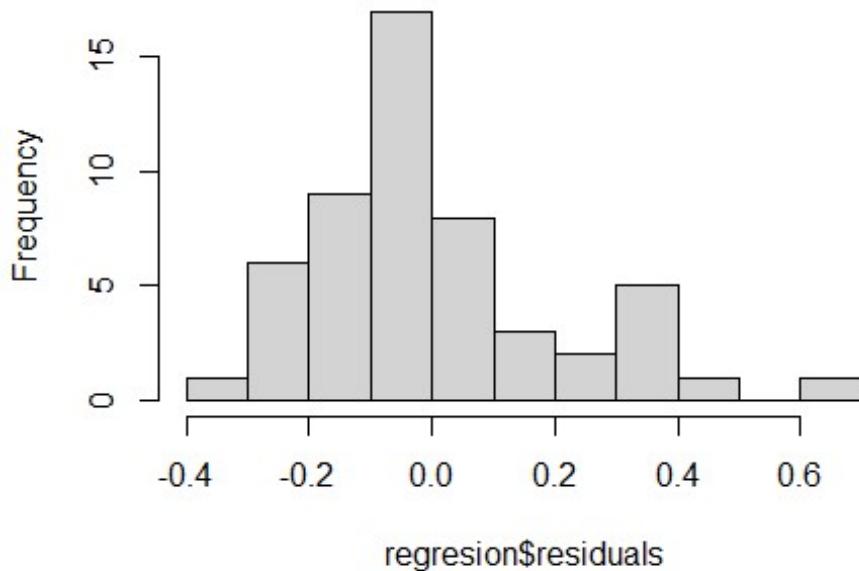


```
shapiro.test(regresion$residuals)

##
##  Shapiro-Wilk normality test
##
## data: regresion$residuals
## W = 0.91826, p-value = 0.001441

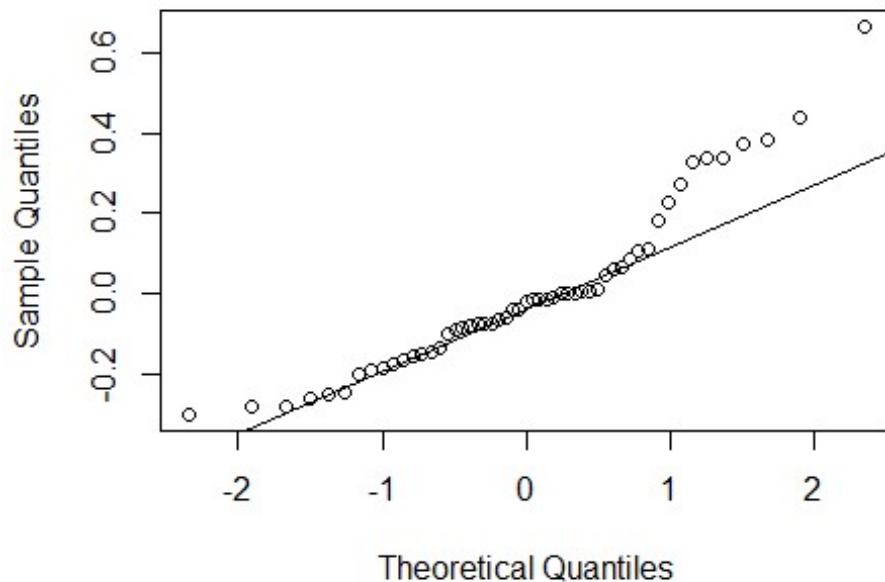
hist(regresion$residuals)
```

Histogram of regresion\$residuals



```
qqnorm(regresion$residuals)
qqline(regresion$residuals)
```

Normal Q-Q Plot



```
t.test(regresion$residuals)

##
##  One Sample t-test
##
## data: regresion$residuals
## t = 3.6714e-17, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.05708903 0.05708903
## sample estimates:
##   mean of x
## 1.044503e-18

z1=AlcalinidadBC
z2=AlcalinidadBC^2
cor.test(M1$X7 ,z1+ z2)

##
## Pearson's product-moment correlation
##
## data: M1$X7 and z1 + z2
## t = -5.5505, df = 51, p-value = 1.028e-06
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.7582009 -0.4116597
## sample estimates:
```

```

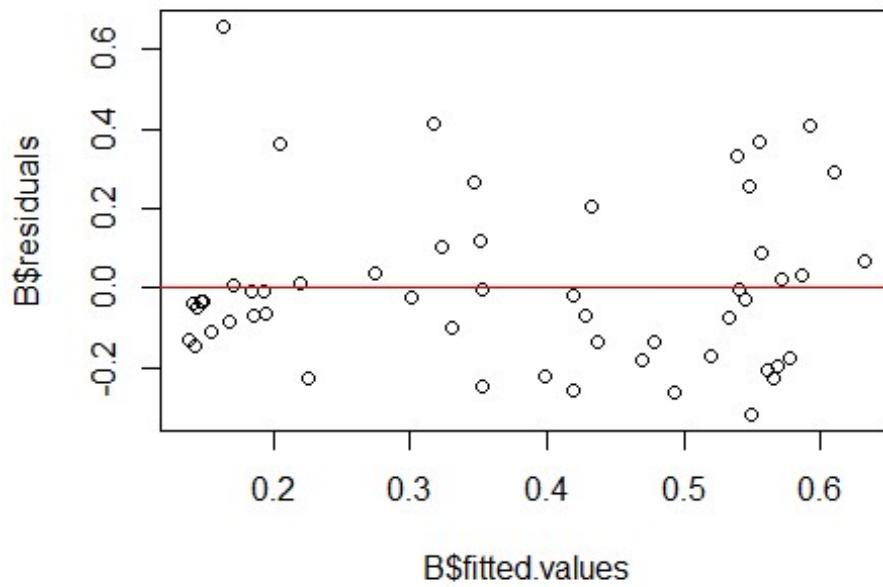
##      cor
## -0.613671

B = lm(M1$X7 ~ z1+ z2)
summary(B)

##
## Call:
## lm(formula = M1$X7 ~ z1 + z2)
##
## Residuals:
##       Min     1Q Median     3Q    Max
## -0.31733 -0.13708 -0.03098  0.06570  0.65757
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)
## (Intercept)  0.63197   0.06793  9.304 1.72e-12 ***
## z1          -2.26013   1.02158 -2.212  0.0315 *
## z2           2.51394   2.69759  0.932  0.3559
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2094 on 50 degrees of freedom
## Multiple R-squared:  0.3967, Adjusted R-squared:  0.3726
## F-statistic: 16.44 on 2 and 50 DF,  p-value: 3.262e-06

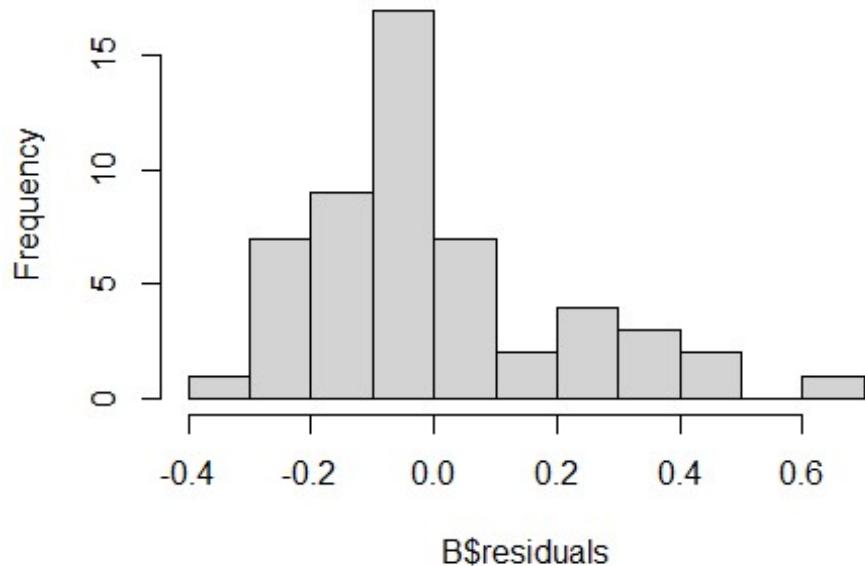
plot(B$fitted.values, B$residuals)
abline(h=0,col="red")

```



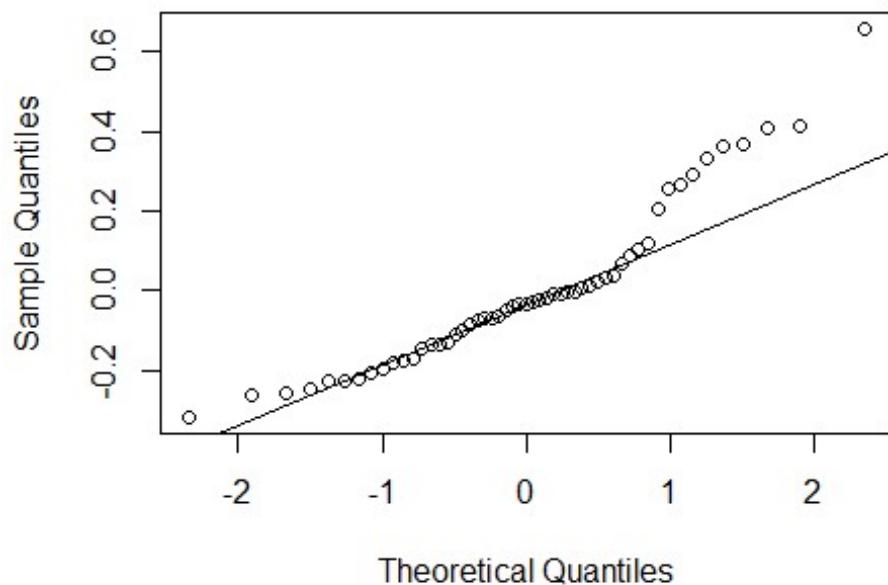
```
shapiro.test(B$residuals)
##
##  Shapiro-Wilk normality test
##
## data: B$residuals
## W = 0.91627, p-value = 0.001216
hist(B$residuals)
```

Histogram of B\$residuals



```
qqnorm(B$residuals)  
qqline(B$residuals)
```

Normal Q-Q Plot



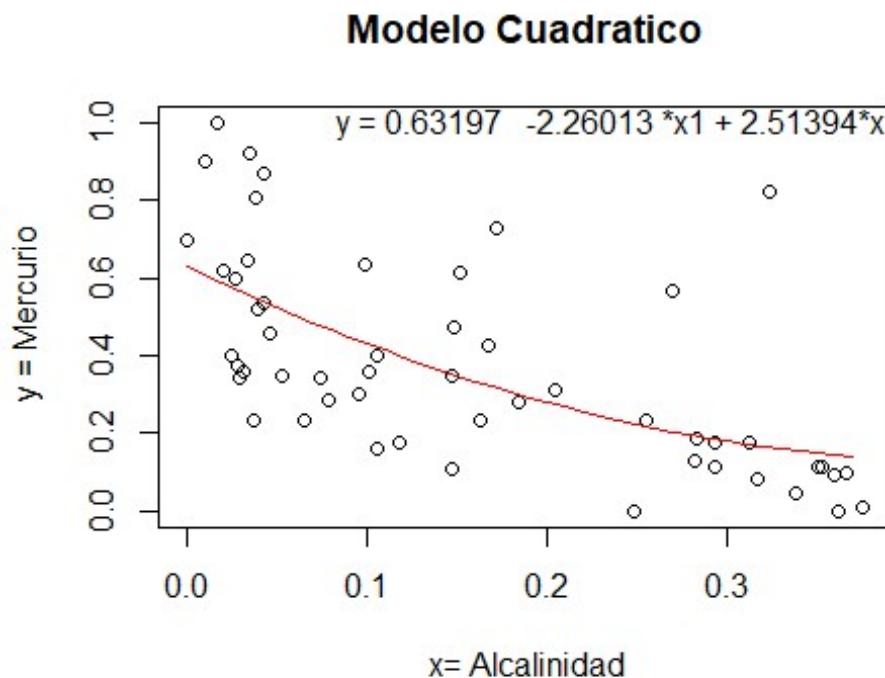
```

t.test(B$residuals)

##
##  One Sample t-test
##
## data: B$residuals
## t = -6.284e-17, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.05659959 0.05659959
## sample estimates:
##      mean of x
## -1.772464e-18

x=AlcalinidadBC
y=M1$X7
plot(x, y, main = "Modelo Cuadratico", xlab =" x= Alcalinidad", ylab =" y = Mercurio")
x1 = seq(min(x), max(x), 0.01)
y1 = 0.63197 -2.26013 *x1 + 2.51394*x1^2
lines(x1, y1, col = "red")
text(.25, 1, "y = 0.63197 -2.26013 *x1 + 2.51394*x1^2")

```



```

z1=AlcalinidadBC+1
z2=log(AlcalinidadBC+1)
cor.test(M1$X7, log(AlcalinidadBC+1))

```

```

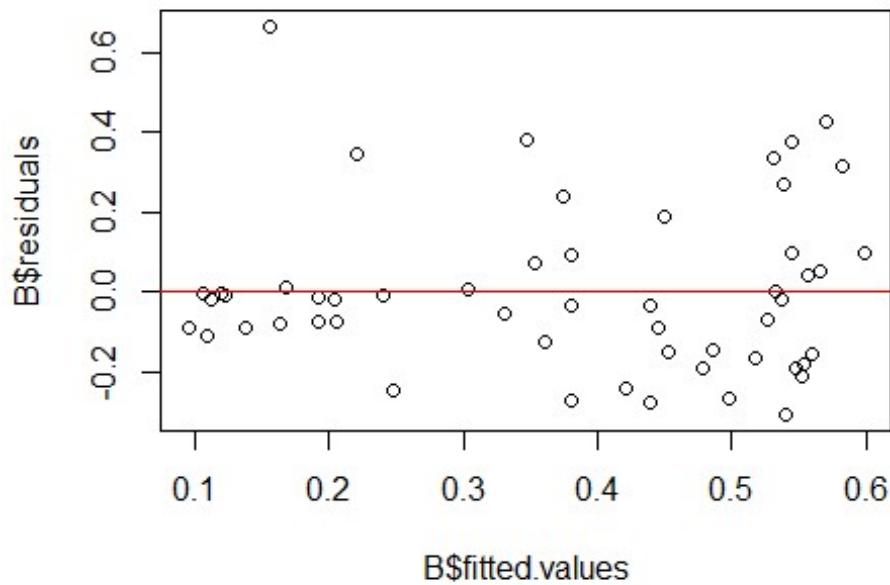
## 
## Pearson's product-moment correlation
## 
## data: M1$X7 and log(AlcalinidadBC + 1)
## t = -5.7215, df = 51, p-value = 5.583e-07
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.7660753 -0.4271425
## sample estimates:
## cor
## -0.6252489

B = lm(M1$X7 ~ log(AlcalinidadBC+1))
summary(B)

##
## Call:
## lm(formula = M1$X7 ~ log(AlcalinidadBC + 1))
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.30699 -0.14424 -0.01974  0.07323  0.66559
##
## Coefficients:
##                               Estimate Std. Error t value Pr(>|t|)
## (Intercept)             0.59832   0.04803 12.458 < 2e-16 ***
## log(AlcalinidadBC + 1) -1.57928   0.27603 -5.721 5.58e-07 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2083 on 51 degrees of freedom
## Multiple R-squared:  0.3909, Adjusted R-squared:  0.379
## F-statistic: 32.74 on 1 and 51 DF,  p-value: 5.583e-07

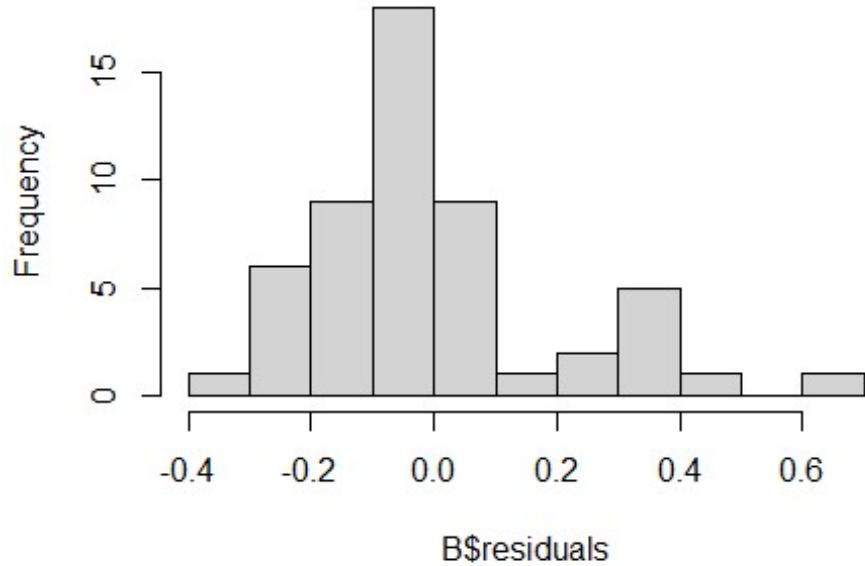
plot(B$fitted.values, B$residuals)
abline(h=0,col="red")

```



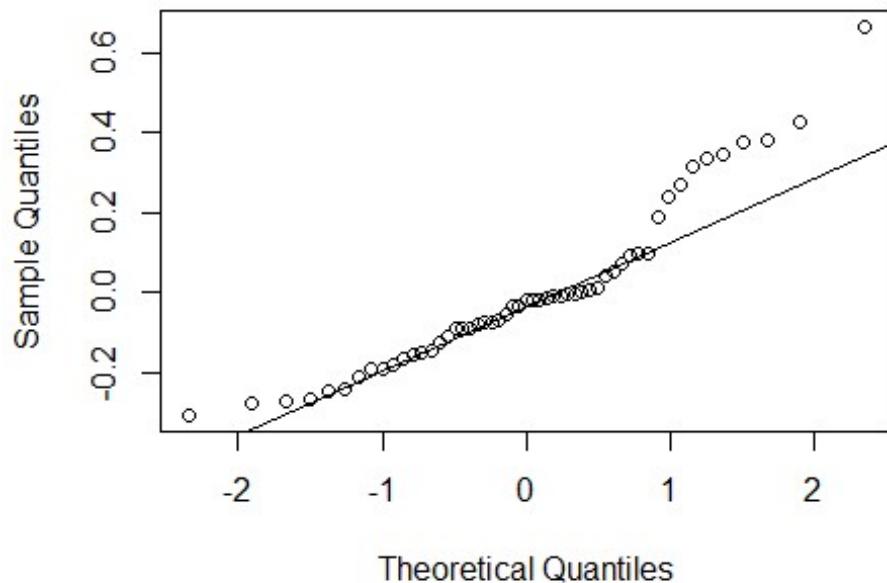
```
shapiro.test(B$residuals)
##
##  Shapiro-Wilk normality test
##
## data: B$residuals
## W = 0.91764, p-value = 0.001367
hist(B$residuals)
```

Histogram of B\$residuals



```
qqnorm(B$residuals)  
qqline(B$residuals)
```

Normal Q-Q Plot



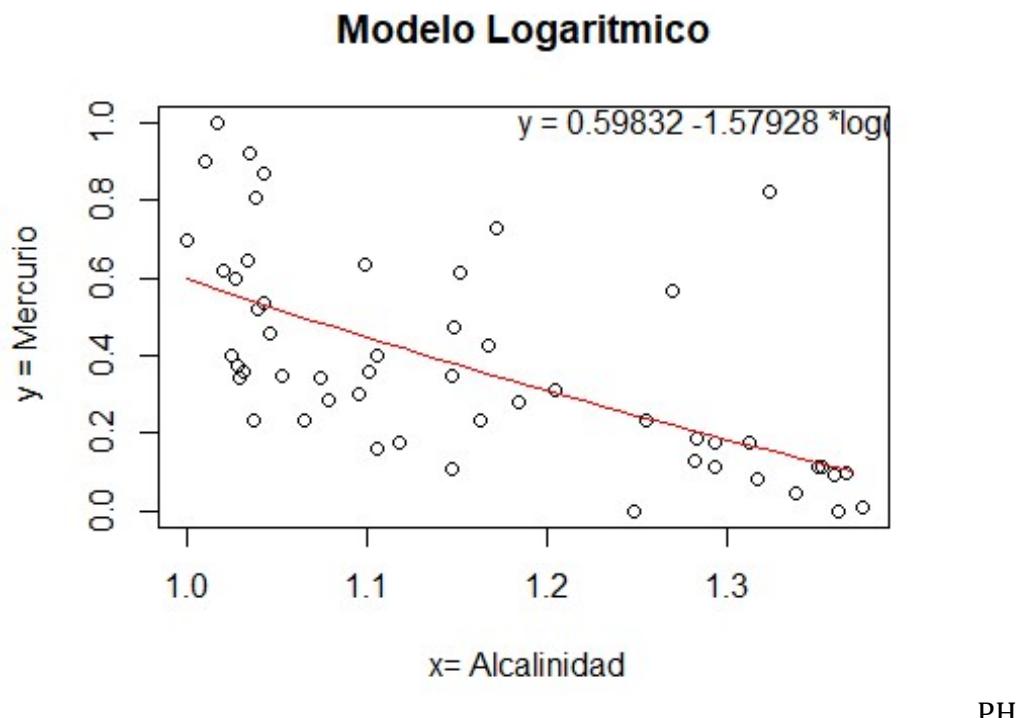
```

t.test(B$residuals)

##
##  One Sample t-test
##
## data: B$residuals
## t = 2.9567e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.05686885 0.05686885
## sample estimates:
##   mean of x
## 8.379489e-18

x=AlcalinidadBC+1
y=M1$X7
plot(x, y, main = "Modelo Logaritmico", xlab =" x= Alcalinidad", ylab =" y = Mercurio")
x1 = seq(min(x), max(x), 0.01)
y1 = 0.59832 -1.57928 *log(x1)
lines(x1, y1, col = "red")
text(1.3, 1, "y = 0.59832 -1.57928 *log(x1)")

```



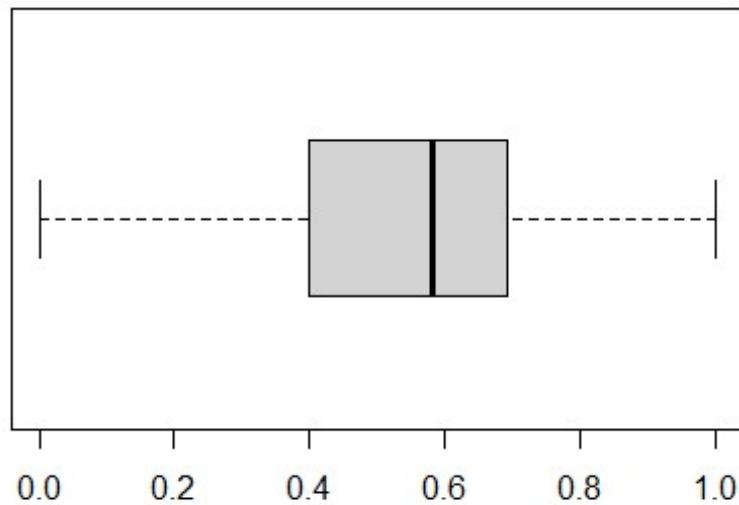
```

q1=quantile(M1$X4,0.25) #Cuartil 1 de la variable X
q2=quantile(M1$X4,0.5)
q3=quantile(M1$X4,0.75)
y1=min(M1$X4)

```

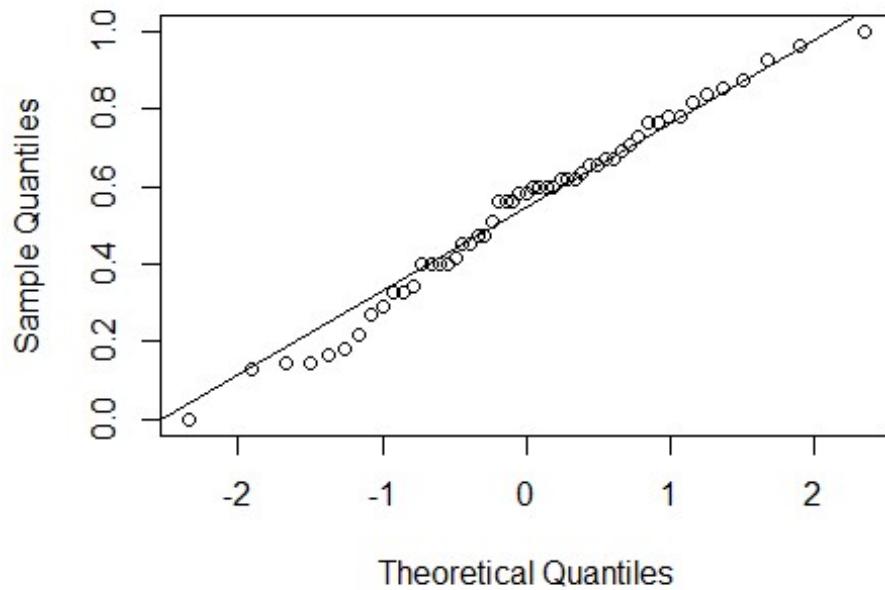
PH

```
y2=max(M1$X4)
ri=IQR(M1$X4)
boxplot(M1$X4, horizontal=TRUE, ylim=c(y1,y2))
abline(v=q3+1.5*ri, col="red")
```



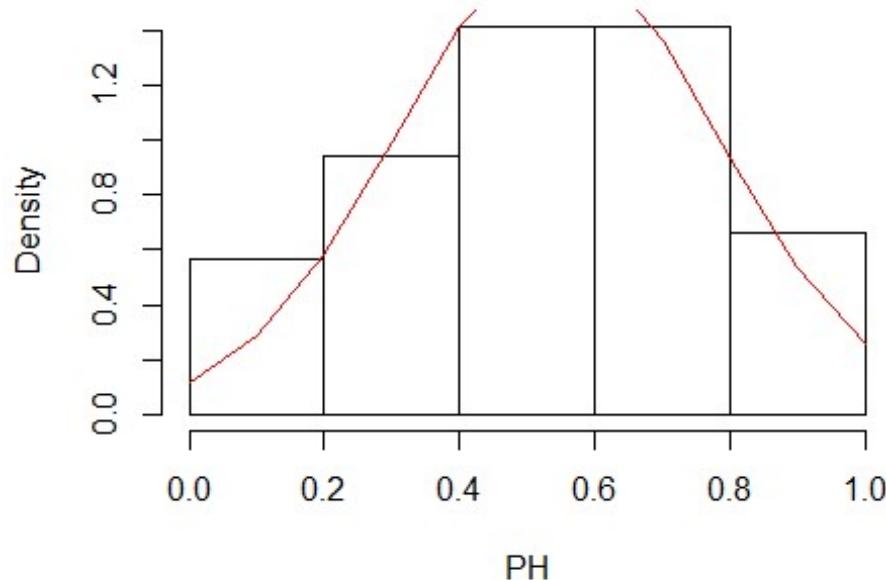
```
PH= M1[M1$X4<q3+1.5*ri, c("X4")]
qqnorm(PH)
qqline(PH)
```

Normal Q-Q Plot



```
hist(PH,prob=TRUE,col=0)
x=seq(min(PH),max(PH),0.1)
y=dnorm(x,mean(PH),sd(PH))
lines(x,y,col="red")
```

Histogram of PH



```
library(moments)
skewness1=skewness(PH)
cat("Sesgo: ",skewness1)

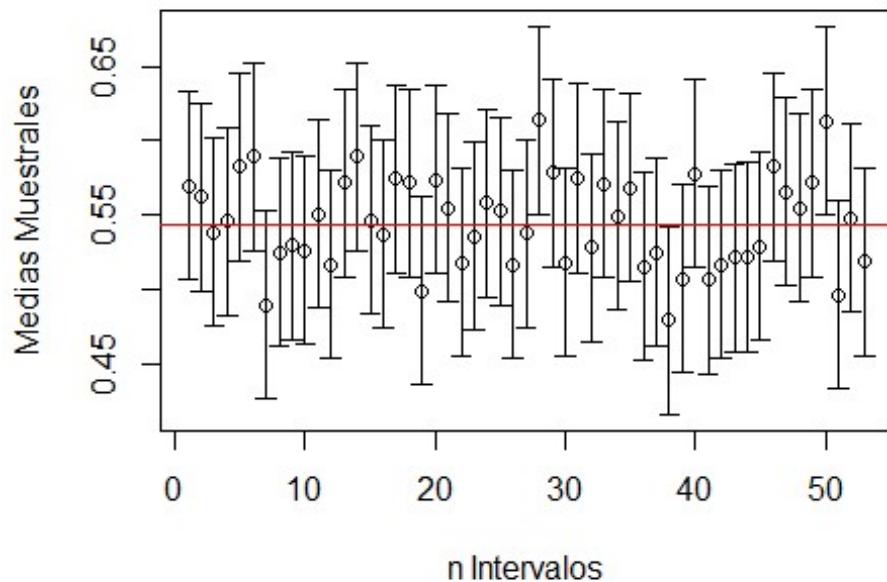
## Sesgo: -0.2530037
cat("\n")

kurtosis1=kurtosis(PH)
cat("Curtosis: ",kurtosis1)

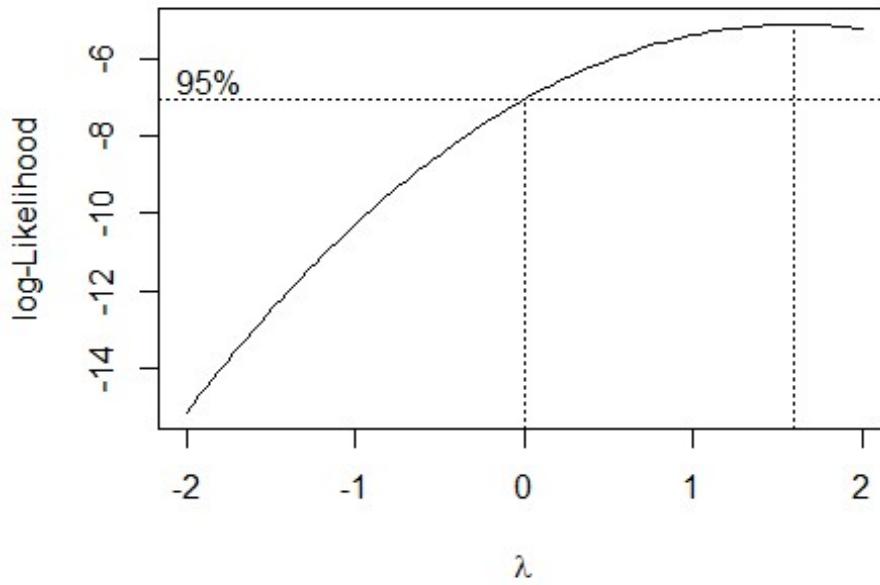
## Curtosis: 2.468301
cat("\n")

library(plotrix)
n=length(PH)
media=mean(PH)
DE=sd(PH)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias
Muestrales")
abline(h=media,col="red")
```

Gráfico de IC



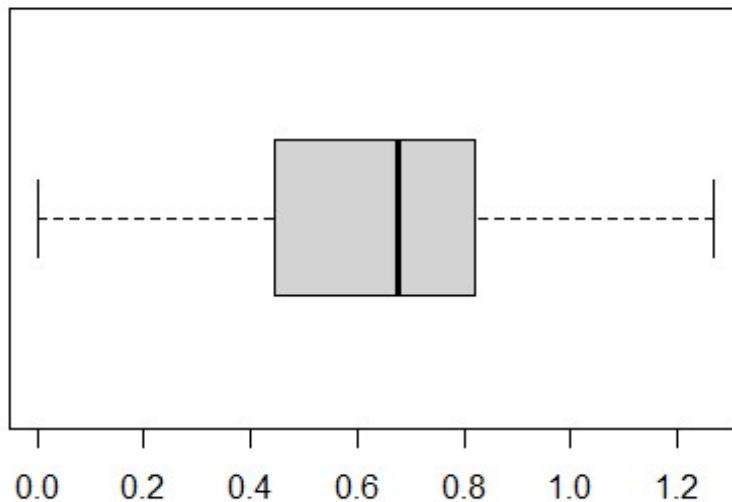
```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de: 0.5437393 +- 0.06306883
library(MASS)
minim=min(M1$X4)
b <- boxcox(lm((M1$X4+1) ~ 1))
```



```

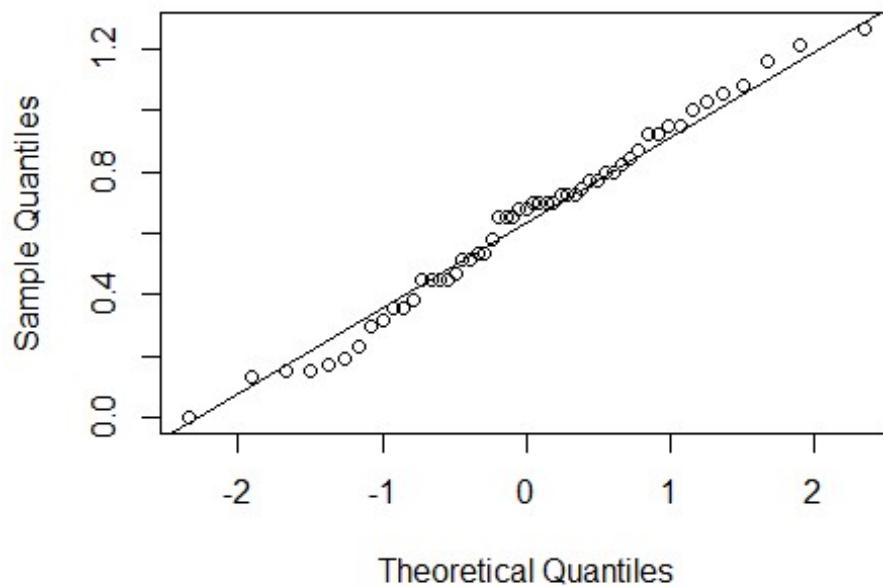
lambda <- b$x[which.max(b$y)]
X4<-(M1$X4+1)^lambda-1)/lambda
q1=quantile(X4,0.25) #Cuantil 1 de la variable X
q2=quantile(X4,0.5)
q3=quantile(X4,0.75)
y1=min(X4)
y2=max(X4)
ri=IQR(X4)
boxplot(X4, horizontal=TRUE, ylim=c(y1,y2))
abline(v=q3+1.5*ri,col="red")

```



```
PHBC = X4  
qqnorm(PHBC)  
qqline(PHBC)
```

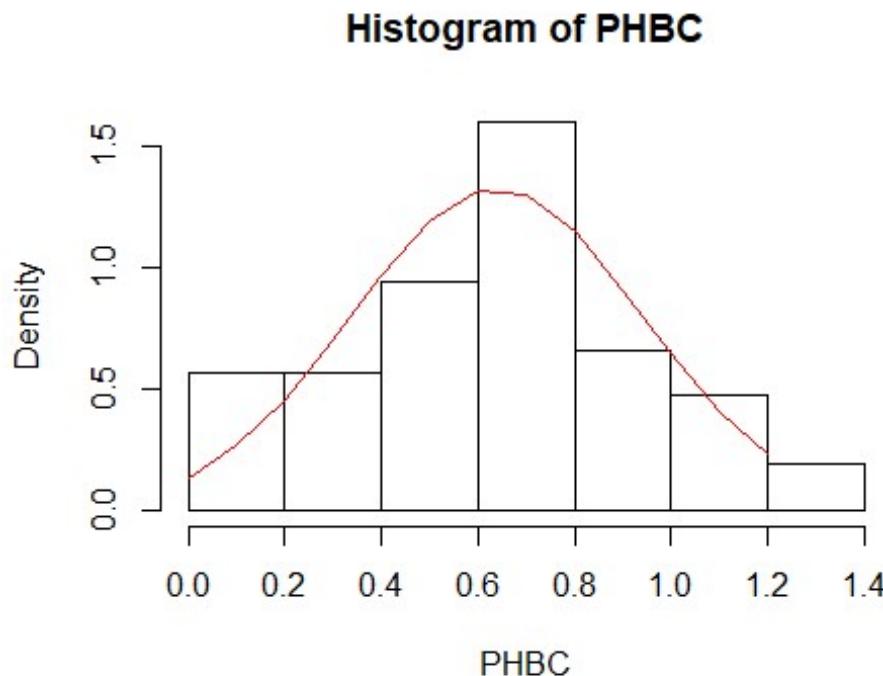
Normal Q-Q Plot



```

hist(PHBC,prob=TRUE,col=0)
x=seq(min(PHBC),max(PHBC),0.1)
y=dnorm(x,mean(PHBC),sd(PHBC))
lines(x,y,col="red")

```



```

library(moments)
skewness1=skewness(PHBC)
cat("Sesgo: ",skewness1)

## Sesgo: -0.06020792

cat("\n")

kurtosis1=kurtosis(PHBC)
cat("Curtosis: ",kurtosis1)

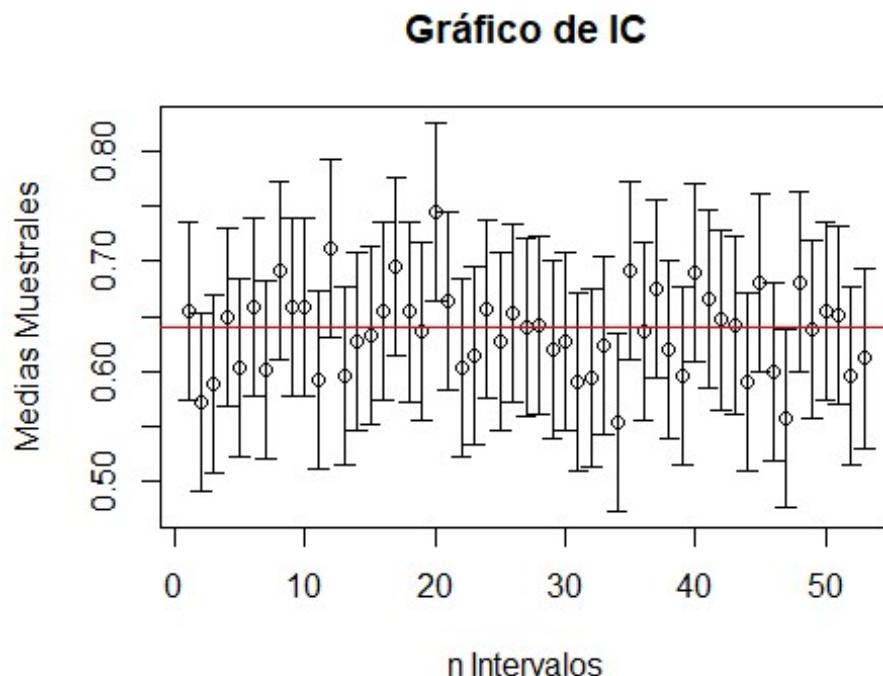
## Curtosis: 2.413642

cat("\n")

library(plotrix)
n=length(PHBC)
media=mean(PHBC)
DE=sd(PHBC)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)

```

```
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias Muestrales")
abline(h=media,col="red")
```



```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de:  0.6399393  +-  0.08069817
cor.test(M1$X7,M1$X4)

##
## Pearson's product-moment correlation
##
## data:  M1$X7 and M1$X4
## t = -5.0242, df = 51, p-value = 6.573e-06
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.7318685 -0.3612979
## sample estimates:
##      cor
## -0.5754001

regresion=lm(M1$X7 ~ M1$X4)
regresion

##
## Call:
## lm(formula = M1$X7 ~ M1$X4)
```

```

##  

## Coefficients:  

## (Intercept)      M1$X4  

##       0.7307     -0.6493  

PH=summary(regresion)  

PH  

##  

## Call:  

## lm(formula = M1$X7 ~ M1$X4)  

##  

## Residuals:  

##      Min       1Q   Median       3Q      Max  

## -0.37903 -0.14875 -0.04476  0.07330  0.55142  

##  

## Coefficients:  

##              Estimate Std. Error t value Pr(>|t|)  

## (Intercept)  0.73073   0.07641   9.564 5.77e-13 ***  

## M1$X4        -0.64934   0.12924  -5.024 6.57e-06 ***  

## ---  

## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1  

##  

## Residual standard error: 0.2183 on 51 degrees of freedom  

## Multiple R-squared:  0.3311, Adjusted R-squared:  0.318  

## F-statistic: 25.24 on 1 and 51 DF,  p-value: 6.573e-06  

plot(M1$X4,M1$X7,col="blue",xlab="PH",ylab="Concentracion de  

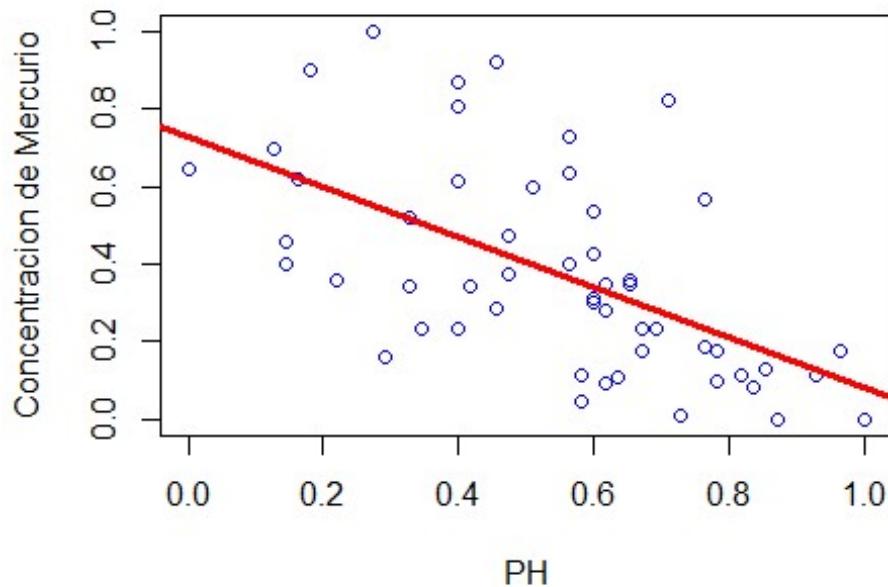
Mercurio",main="PH vs. Concentracion de Mercurio")  

abline(regresion,col="red",lwd=3)  

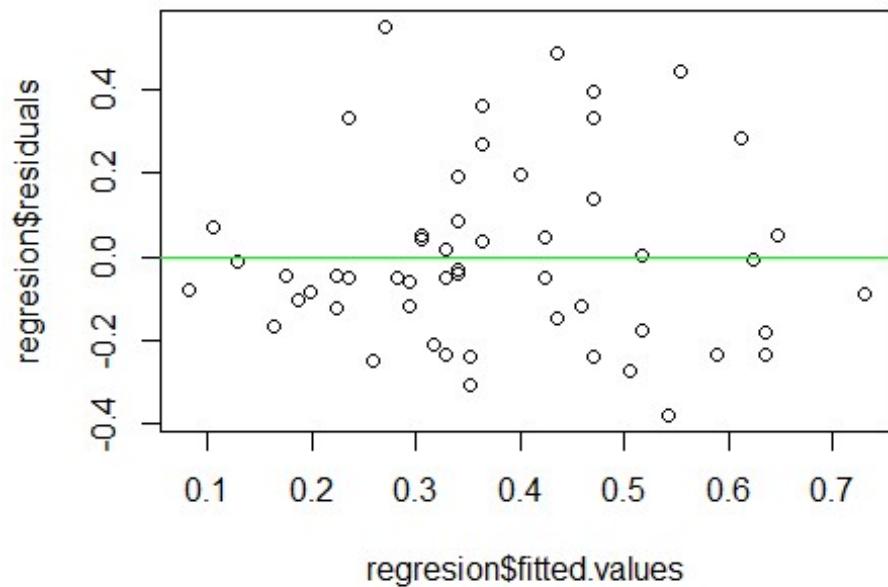
text(80,1.2,"B1=-0.005302 B0=0.726140")

```

PH vs. Concentracion de Mercurio



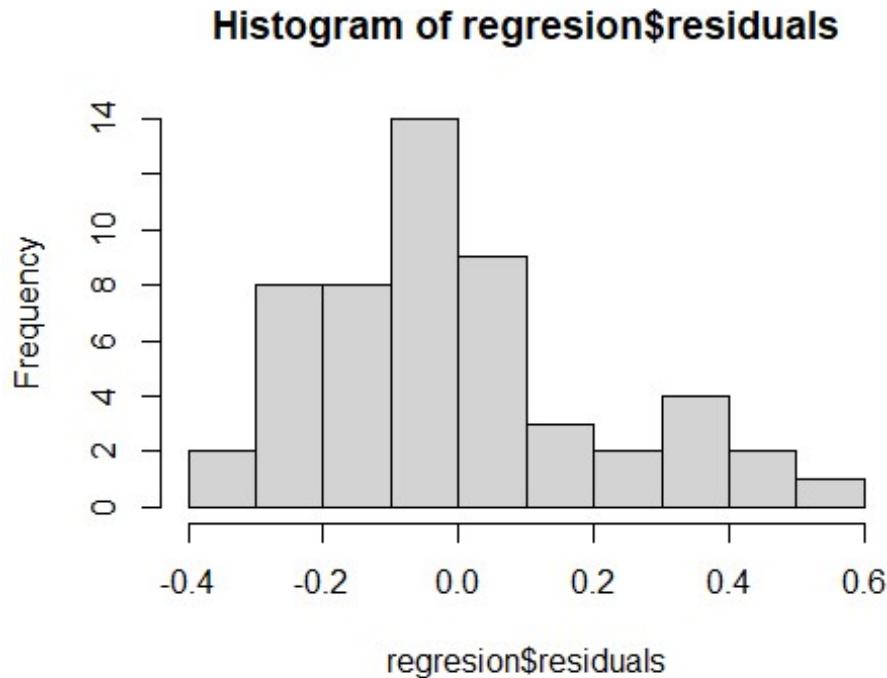
```
plot(regresion$fitted.values, regresion$residuals)
abline(h=0,col="green")
```



```
shapiro.test(regresion$residuals)

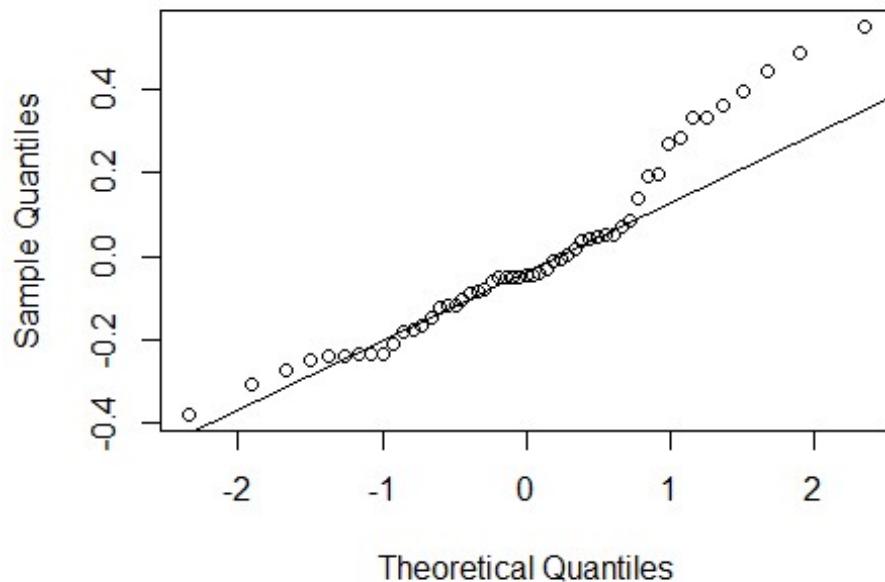
##
##  Shapiro-Wilk normality test
##
## data: regresion$residuals
## W = 0.93853, p-value = 0.008887

hist(regresion$residuals)
```



```
qqnorm(regresion$residuals)
qqline(regresion$residuals)
```

Normal Q-Q Plot



```
t.test(regresion$residuals)

##
##  One Sample t-test
##
##  data: regresion$residuals
##  t = 8.3755e-16, df = 52, p-value = 1
##  alternative hypothesis: true mean is not equal to 0
##  95 percent confidence interval:
##  -0.05959755  0.05959755
##  sample estimates:
##    mean of x
##  2.487541e-17

cor.test(M1$X7,PHBC)

##
##  Pearson's product-moment correlation
##
##  data: M1$X7 and PHBC
##  t = -5.0981, df = 51, p-value = 5.081e-06
##  alternative hypothesis: true correlation is not equal to 0
##  95 percent confidence interval:
##  -0.7357608 -0.3686084
##  sample estimates:
##    cor
##  -0.5810142
```

```

regresion=lm(M1$X7 ~ PHBC)
regresion

##
## Call:
## lm(formula = M1$X7 ~ PHBC)
##
## Coefficients:
## (Intercept)      PHBC
##           0.7056     -0.5124

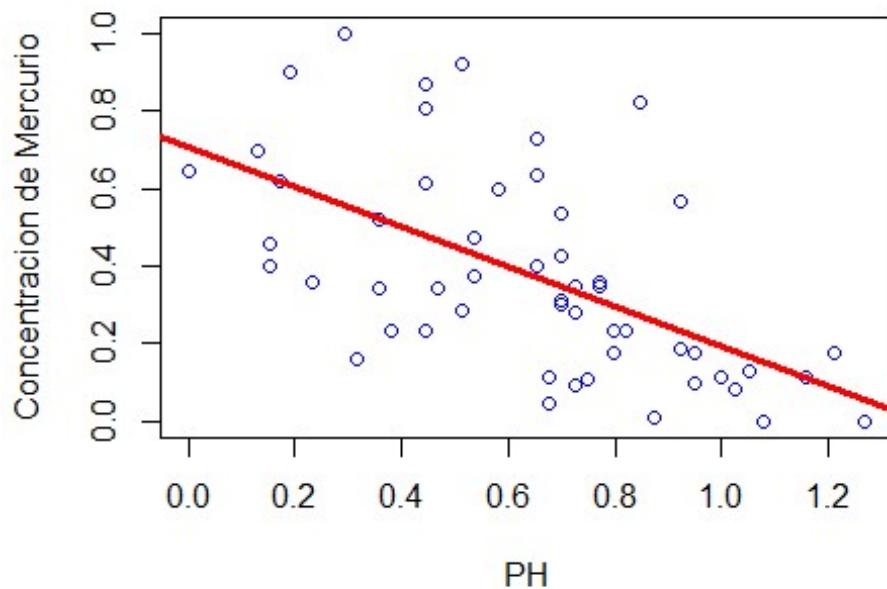
PH=summary(regresion)
PH

##
## Call:
## lm(formula = M1$X7 ~ PHBC)
##
## Residuals:
##    Min     1Q   Median     3Q    Max
## -0.38126 -0.15273 -0.04453  0.07950  0.55031
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)
## (Intercept)  0.70558   0.07091   9.950 1.53e-13 ***
## PHBC        -0.51244   0.10052  -5.098 5.08e-06 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2173 on 51 degrees of freedom
## Multiple R-squared:  0.3376, Adjusted R-squared:  0.3246
## F-statistic: 25.99 on 1 and 51 DF,  p-value: 5.081e-06

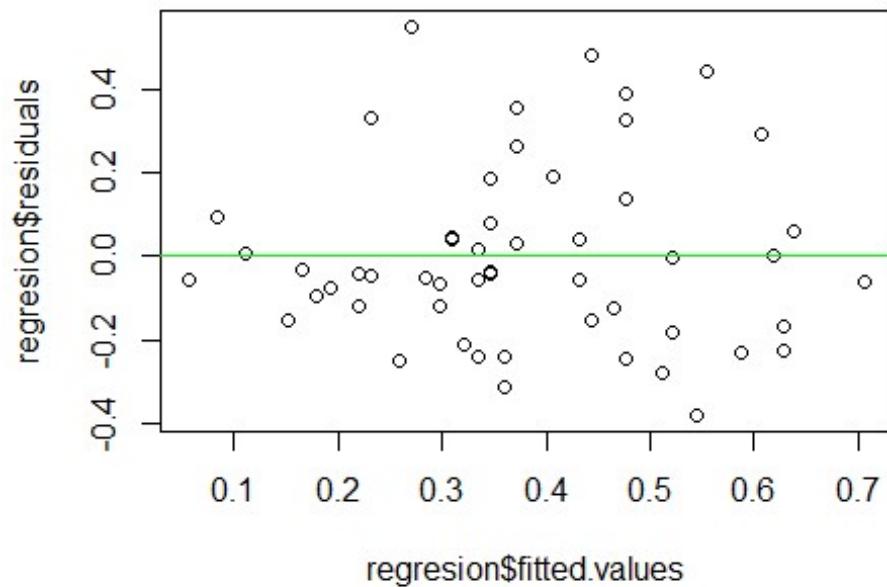
plot(PHBC,M1$X7,col="blue",xlab="PH",ylab="Concentracion de
Mercurio",main="PH Box-Cox vs. Concentracion de Mercurio")
abline(regresion,col="red",lwd=3)
text(80,1.2,"B1=-0.005302 B0=0.726140")

```

PH Box-Cox vs. Concentracion de Mercurio



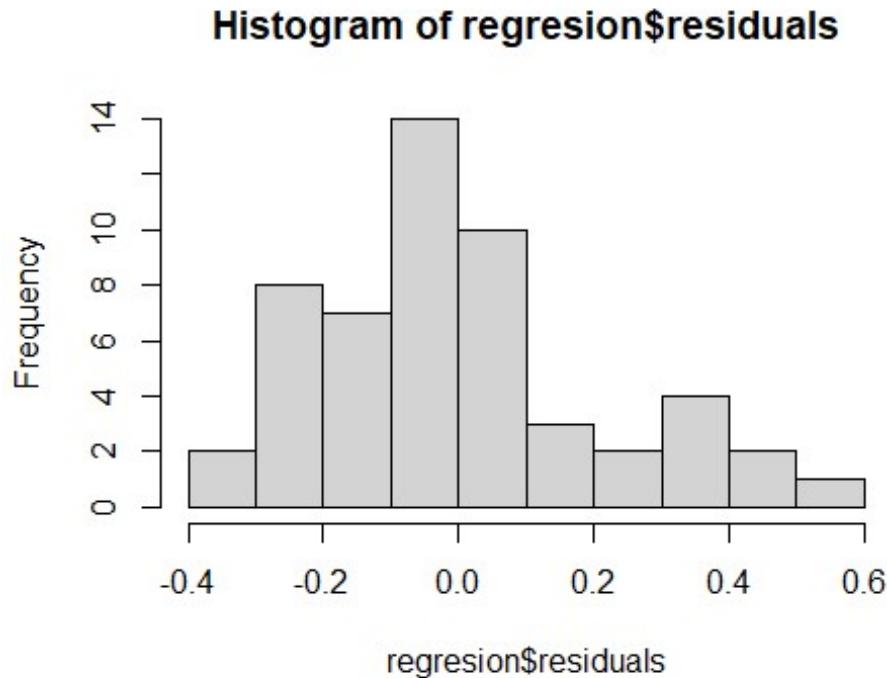
```
plot(regresion$fitted.values, regresion$residuals)
abline(h=0,col="green")
```



```
shapiro.test(regresion$residuals)

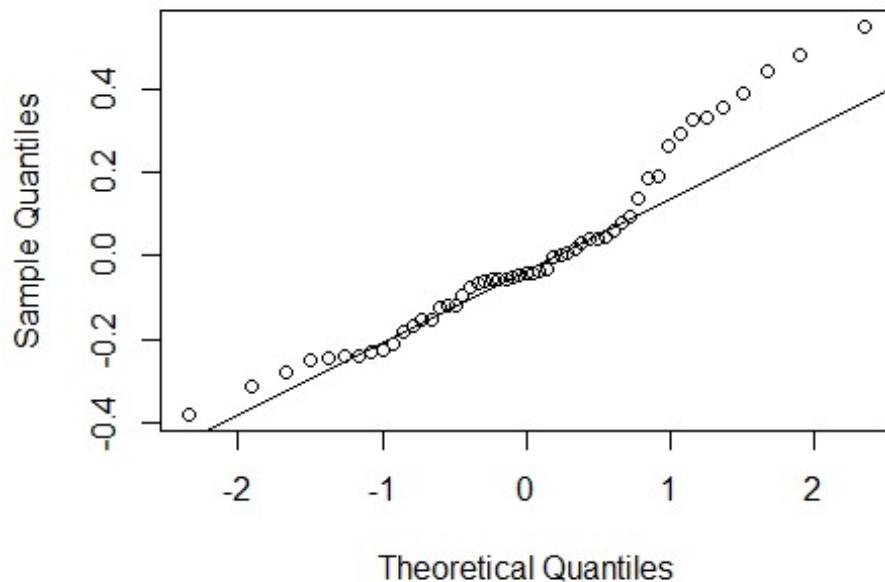
##
##  Shapiro-Wilk normality test
##
## data: regresion$residuals
## W = 0.94241, p-value = 0.01285

hist(regresion$residuals)
```



```
qqnorm(regresion$residuals)
qqline(regresion$residuals)
```

Normal Q-Q Plot



```
t.test(regresion$residuals)

##
##  One Sample t-test
##
## data: regresion$residuals
## t = 9.3433e-17, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.05930763  0.05930763
## sample estimates:
##   mean of x
## 2.761455e-18

z1=PHBC
z2=PHBC^2
cor.test(M1$X7 , z1+ z2)

##
## Pearson's product-moment correlation
##
## data: M1$X7 and z1 + z2
## t = -5.1745, df = 51, p-value = 3.888e-06
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.7397192 -0.3760899
## sample estimates:
```

```

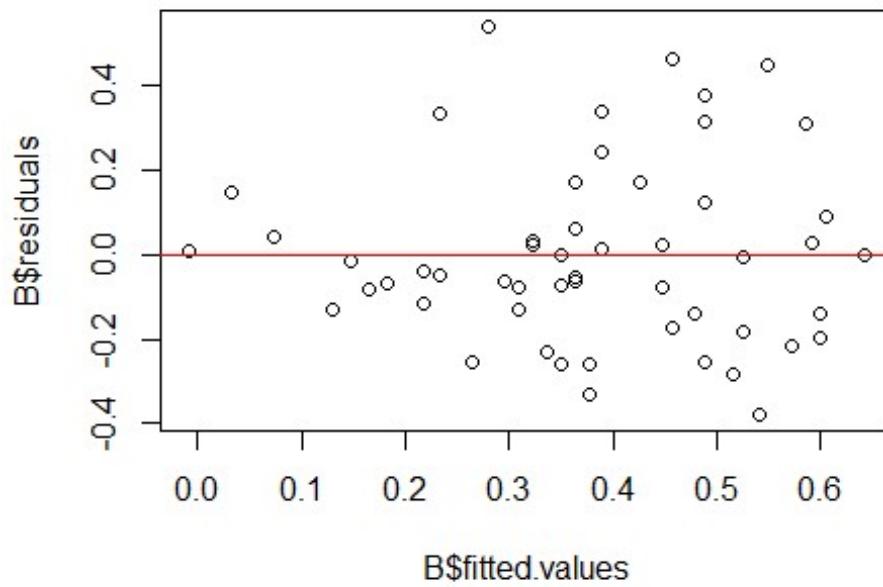
##          cor
## -0.5867389

B = lm(M1$X7 ~ z1+ z2)
summary(B)

##
## Call:
## lm(formula = M1$X7 ~ z1 + z2)
##
## Residuals:
##    Min      1Q  Median      3Q     Max
## -0.37890 -0.13748 -0.03855  0.09279  0.54179
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)
## (Intercept)  0.6419    0.1138   5.638 7.94e-07 ***
## z1          -0.2530    0.3754  -0.674   0.503
## z2          -0.2056    0.2865  -0.718   0.476
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2183 on 50 degrees of freedom
## Multiple R-squared:  0.3443, Adjusted R-squared:  0.3181
## F-statistic: 13.13 on 2 and 50 DF,  p-value: 2.613e-05

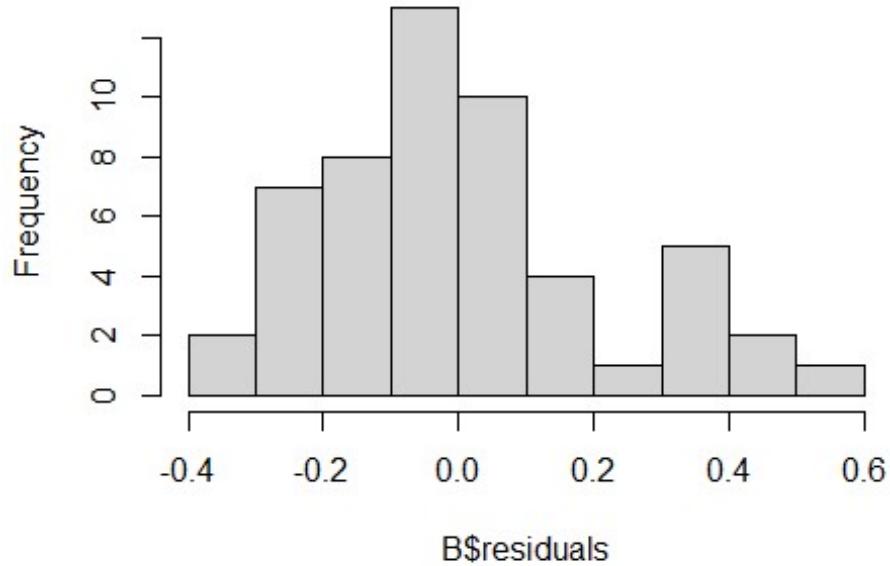
plot(B$fitted.values, B$residuals)
abline(h=0,col="red")

```



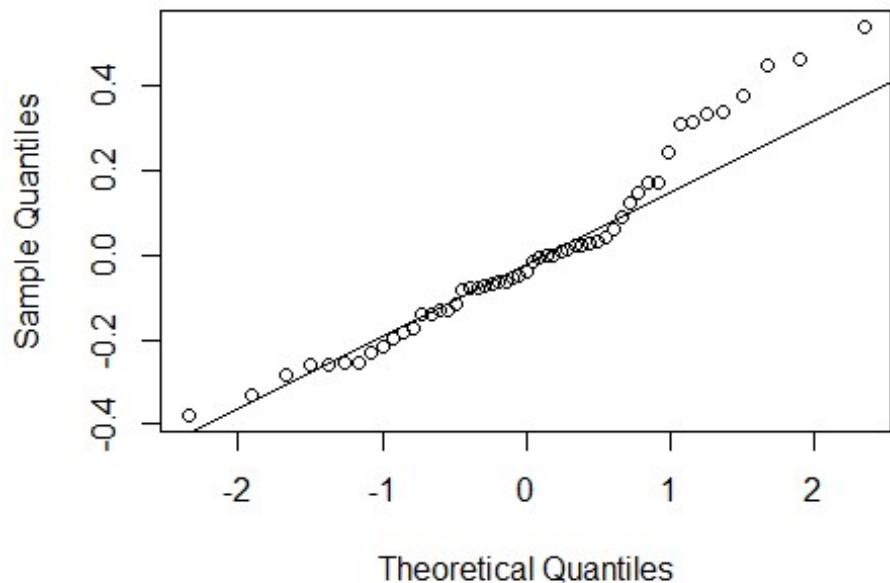
```
shapiro.test(B$residuals)
##
##  Shapiro-Wilk normality test
##
## data: B$residuals
## W = 0.951, p-value = 0.02971
hist(B$residuals)
```

Histogram of B\$residuals



```
qqnorm(B$residuals)  
qqline(B$residuals)
```

Normal Q-Q Plot



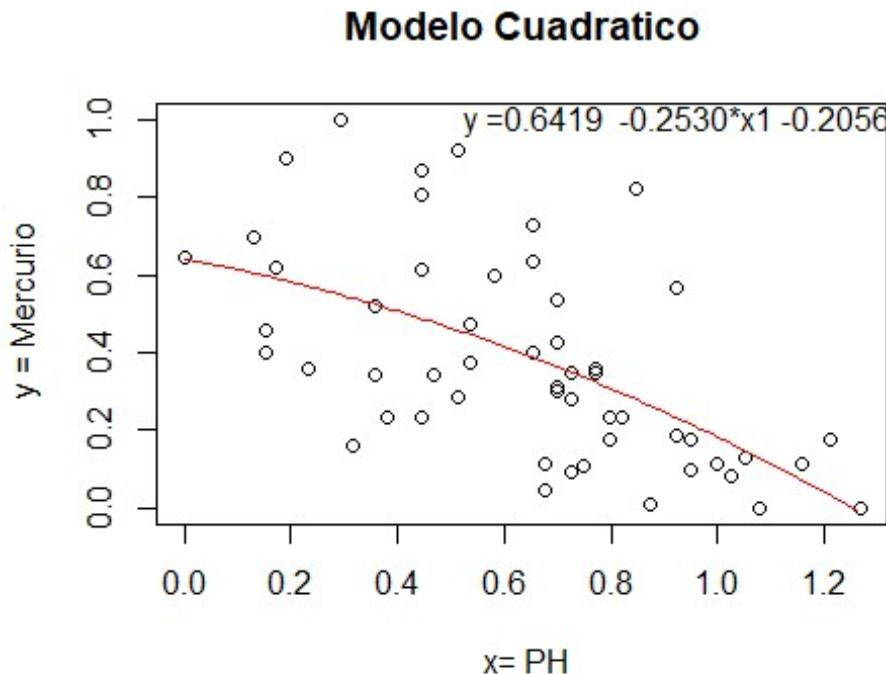
```

t.test(B$residuals)

##
##  One Sample t-test
##
## data: B$residuals
## t = 2.2312e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.05900453 0.05900453
## sample estimates:
##   mean of x
## 6.560702e-18

x=PHBC
y=M1$X7
plot(x, y, main = "Modelo Cuadratico", xlab = " x= PH", ylab = " y = Mercurio")
x1 = seq(min(x), max(x), 0.01)
y1 = 0.6419 -0.2530*x1 -0.2056*x1^2
lines(x1, y1, col = "red")
text(1, 1, "y =0.6419 -0.2530*x1 -0.2056*x1^2")

```



```

z1=PHBC+1
z2=log(PHBC+1)
cor.test(M1$X7 , log(PHBC+1))

```

```

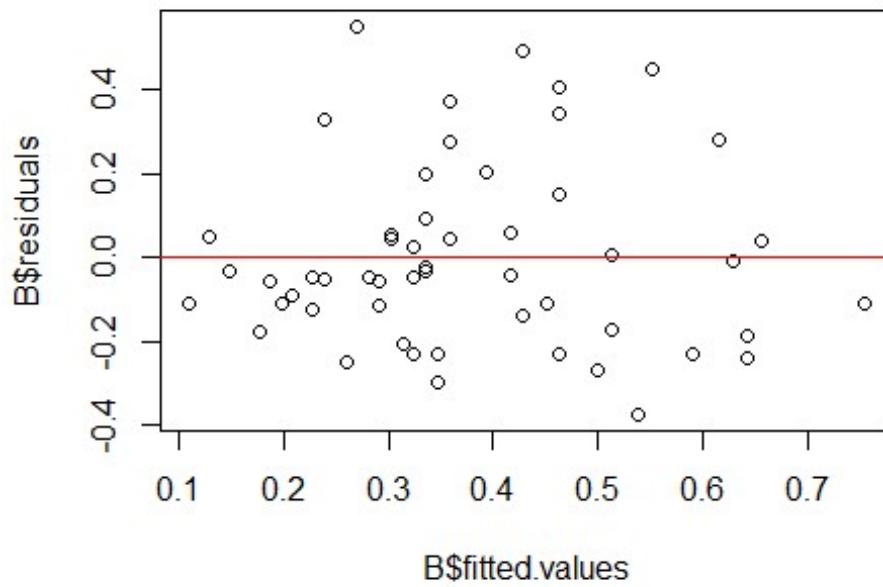
## 
## Pearson's product-moment correlation
## 
## data: M1$X7 and log(PHBC + 1)
## t = -4.9253, df = 51, p-value = 9.268e-06
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.7265433 -0.3513693
## sample estimates:
## cor
## -0.5677429

B = lm(M1$X7 ~ log(PHBC+1))
summary(B)

##
## Call:
## lm(formula = M1$X7 ~ log(PHBC + 1))
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.37547 -0.14093 -0.04545  0.05693  0.55164
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept)  0.75459   0.08227   9.172 2.25e-12 ***
## log(PHBC + 1) -0.78949   0.16029  -4.925 9.27e-06 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2198 on 51 degrees of freedom
## Multiple R-squared:  0.3223, Adjusted R-squared:  0.309
## F-statistic: 24.26 on 1 and 51 DF,  p-value: 9.268e-06

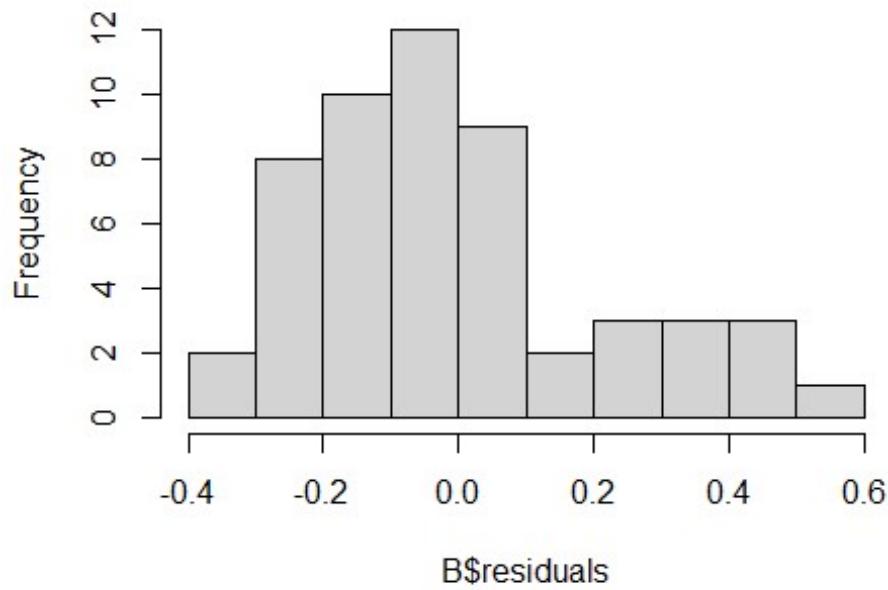
plot(B$fitted.values, B$residuals)
abline(h=0,col="red")

```



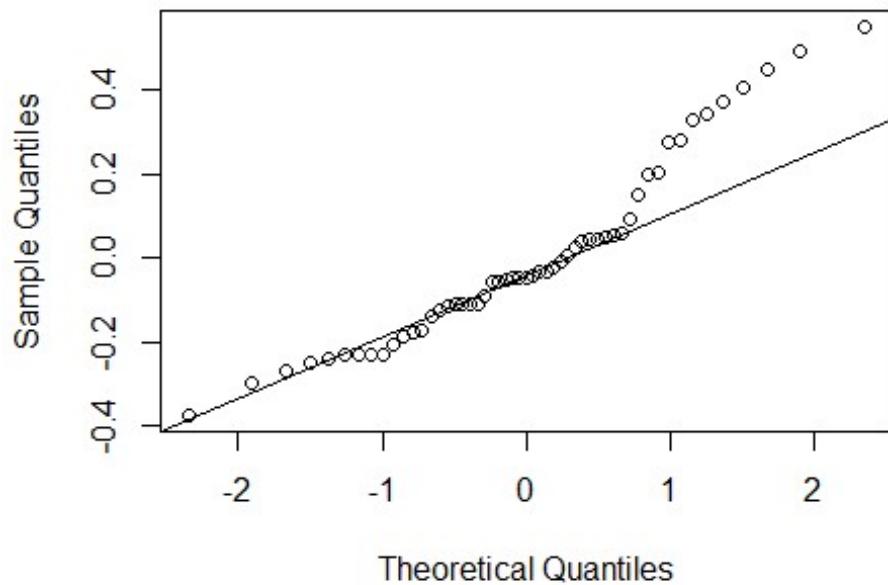
```
shapiro.test(B$residuals)
##
##  Shapiro-Wilk normality test
##
## data: B$residuals
## W = 0.93411, p-value = 0.005889
hist(B$residuals)
```

Histogram of B\$residuals



```
qqnorm(B$residuals)  
qqline(B$residuals)
```

Normal Q-Q Plot



```

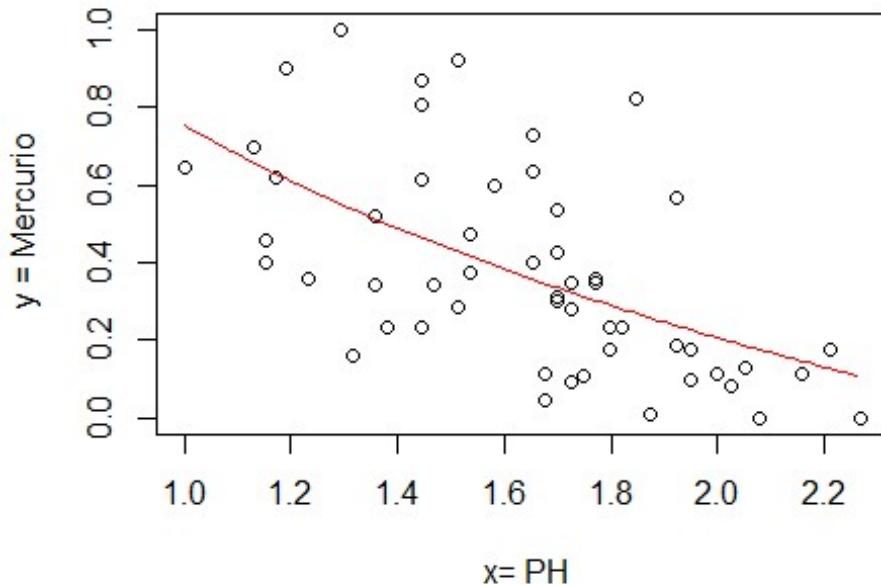
t.test(B$residuals)

##
##  One Sample t-test
##
## data: B$residuals
## t = -1.5739e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.05998623 0.05998623
## sample estimates:
##      mean of x
## -4.705092e-18

x=PHBC+1
y=M1$X7
plot(x, y, main = "Modelo Logaritmico", xlab =" x= PH", ylab =" y =
Mercurio")
x1 = seq(min(x), max(x), 0.01)
y1 = 0.75459 -0.78949*log(x1)
lines(x1, y1, col = "red")
text(1, 1.8, "y = 0.75459 -0.78949*log(x1)")

```

Modelo Logaritmico



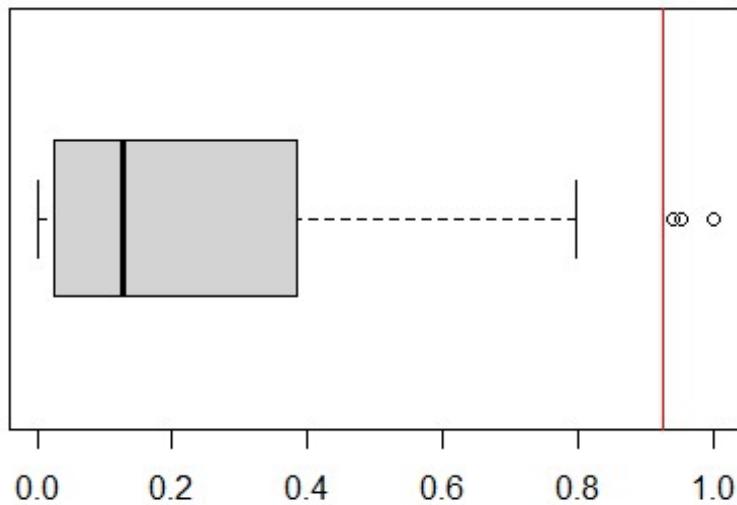
CALCIO

```

q1=quantile(M1$X5,0.25) #Cuantil 1 de la variable X
q2=quantile(M1$X5,0.5)

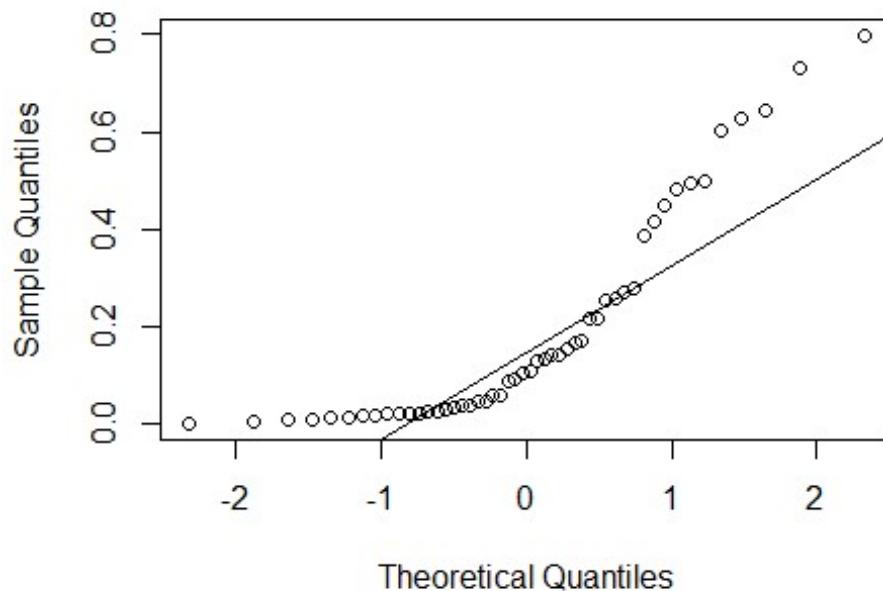
```

```
q3=quantile(M1$X5,0.75)
y1=min(M1$X5)
y2=max(M1$X5)
ri=IQR(M1$X5)
boxplot(M1$X5, horizontal=TRUE, ylim=c(y1,y2))
abline(v=q3+1.5*ri, col="red")
```



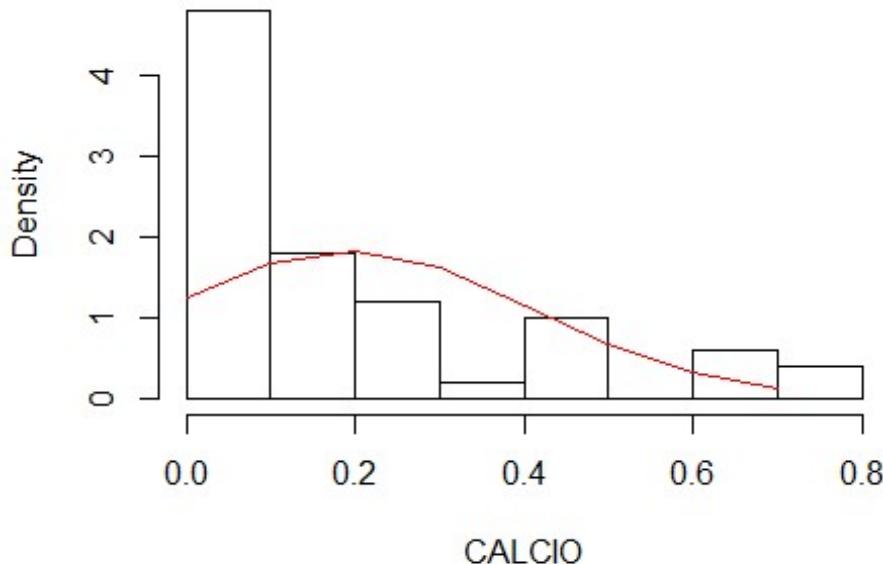
```
CALCIO= M1[M1$X5<q3+1.5*ri,c("X5")]
qqnorm(CALCIO)
qqline(CALCIO)
```

Normal Q-Q Plot



```
hist(CALCIO,prob=TRUE,col=0)
x=seq(min(CALCIO),max(CALCIO),0.1)
y=dnorm(x,mean(CALCIO),sd(CALCIO))
lines(x,y,col="red")
```

Histogram of CALCIO



```
library(moments)
skewness1=skewness(CALCIO)
cat("Sesgo: ",skewness1)

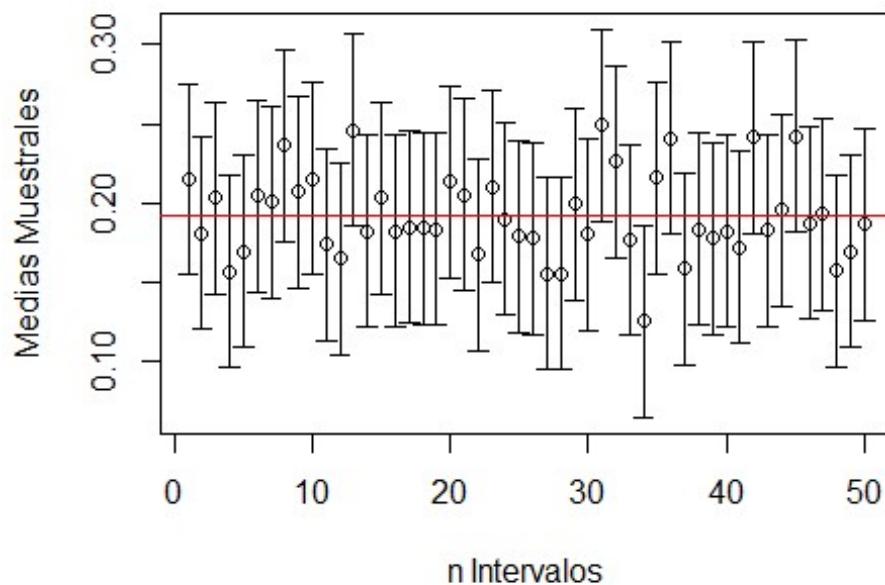
## Sesgo: 1.253402
cat("\n")

kurtosis1=kurtosis(CALCIO)
cat("Curtosis: ",kurtosis1)

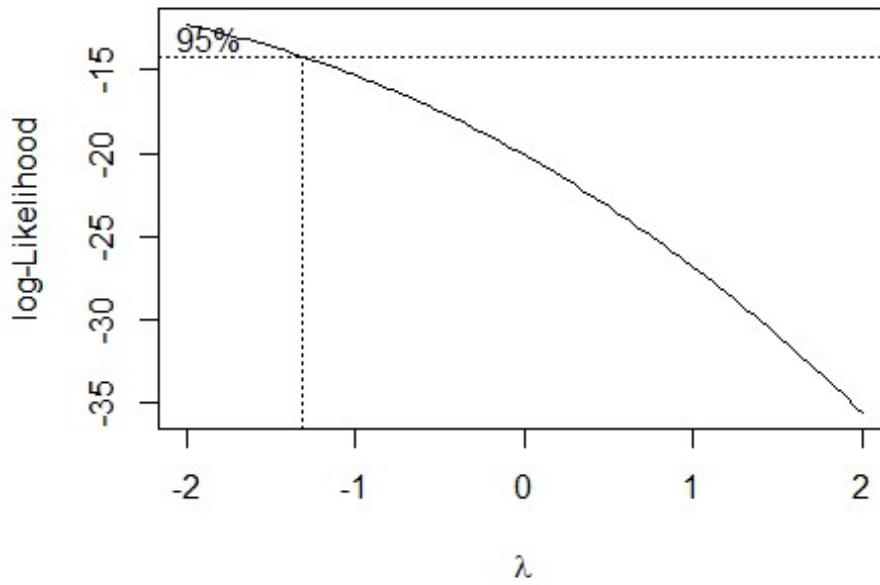
## Curtosis: 3.454808
cat("\n")

library(plotrix)
n=length(CALCIO)
media=mean(CALCIO)
DE=sd(CALCIO)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias
Muestrales")
abline(h=media,col="red")
```

Gráfico de IC



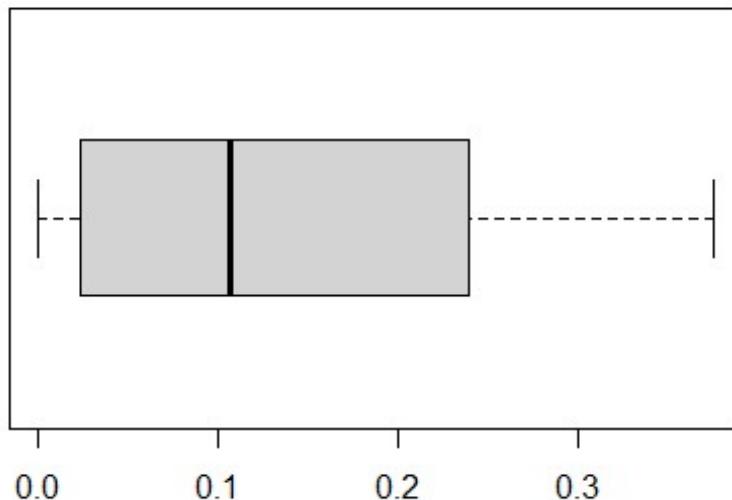
```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de:  0.1917411  +-  0.06047063
library(MASS)
minim=min(M1$X5)
b <- boxcox(lm((M1$X5+1) ~ 1))
```



```

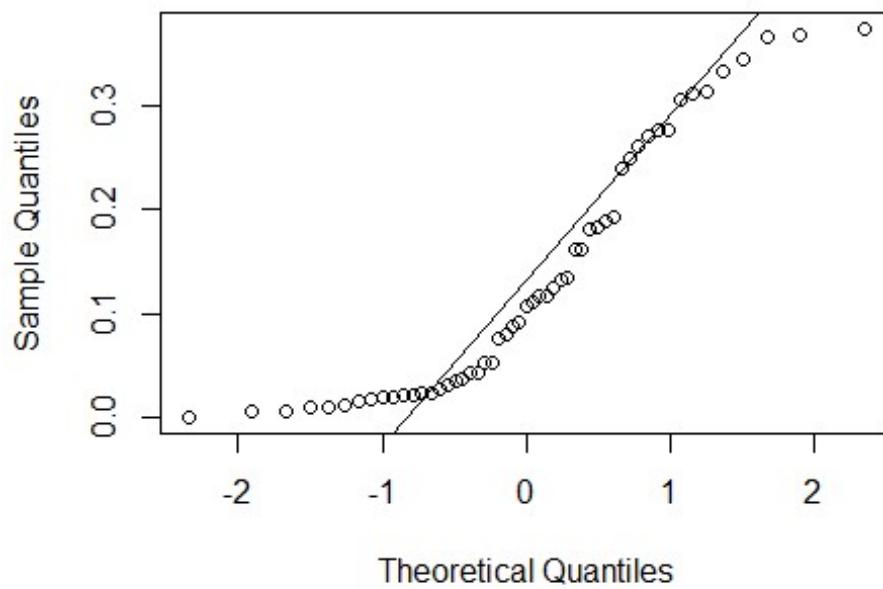
lambda <- b$x[which.max(b$y)]
X5<-(M1$X5+1)^lambda-1)/lambda
q1=quantile(X5,0.25) #Cuantil 1 de la variable X
q2=quantile(X5,0.5)
q3=quantile(X5,0.75)
y1=min(X5)
y2=max(X5)
ri=IQR(X5)
boxplot(X5, horizontal=TRUE, ylim=c(y1,y2))
abline(v=q3+1.5*ri,col="red")

```



```
CALCIOBC= X5  
qqnorm(CALCIOBC)  
qqline(CALCIOBC)
```

Normal Q-Q Plot

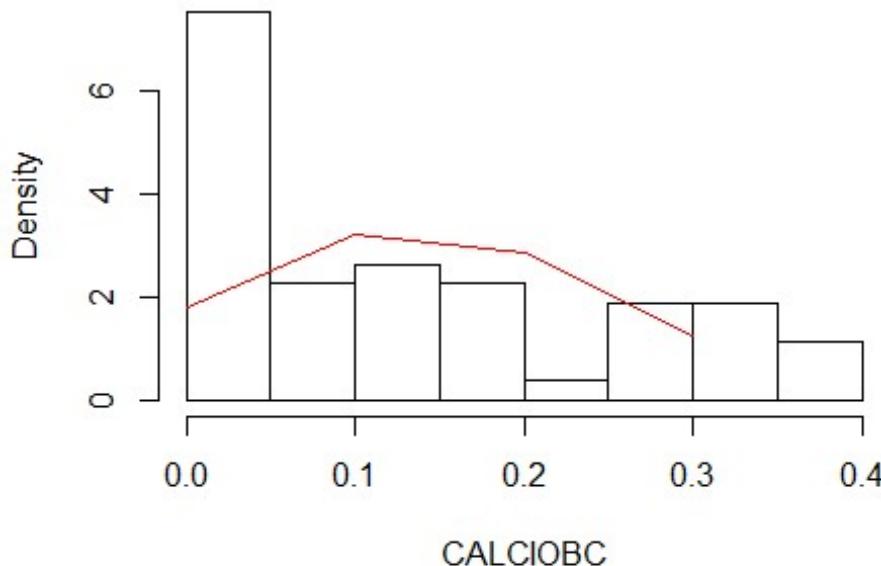


```

hist(CALCIOBC,prob=TRUE,col=0)
x=seq(min(CALCIOBC),max(CALCIOBC),0.1)
y=dnorm(x,mean(CALCIOBC),sd(CALCIOBC))
lines(x,y,col="red")

```

Histogram of CALCIOBC



```

library(moments)
skewness1=skewness(CALCIOBC)
cat("Sesgo: ",skewness1)

## Sesgo:  0.6486829

cat("\n")

kurtosis1=kurtosis(CALCIOBC)
cat("Curtosis: ",kurtosis1)

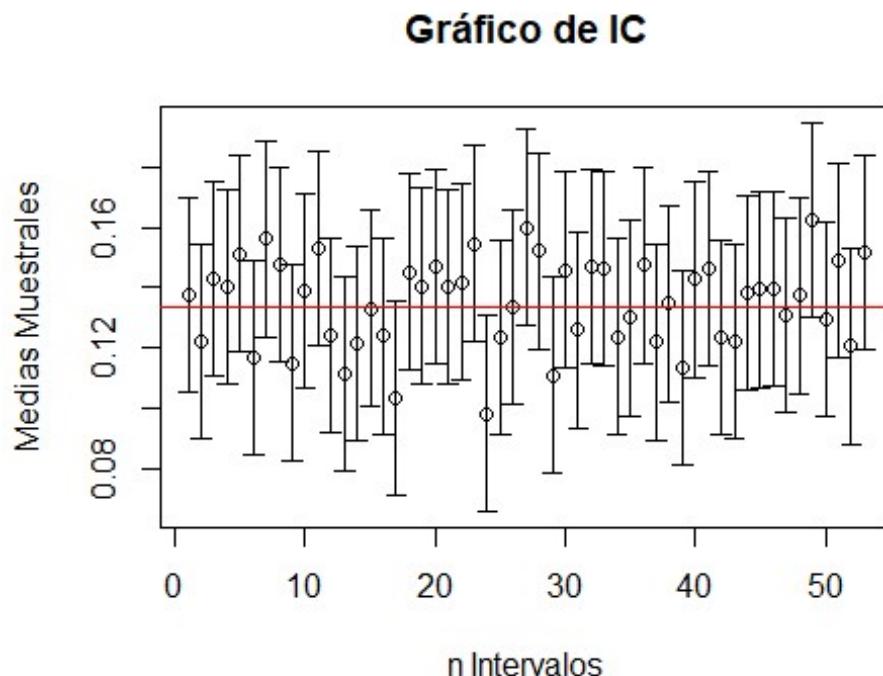
## Curtosis:  2.05392

cat("\n")

library(plotrix)
n=length(CALCIOBC)
media=mean(CALCIOBC)
DE=sd(CALCIOBC)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)

```

```
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias Muestrales")
abline(h=media,col="red")
```



```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de:  0.1334733  +-  0.03217819
cor.test(M1$X7,M1$X5)

##
## Pearson's product-moment correlation
##
## data:  M1$X7 and M1$X5
## t = -3.1231, df = 51, p-value = 0.002948
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  -0.6054071 -0.1462218
## sample estimates:
##      cor
## -0.4006796

regresion=lm(M1$X7 ~ M1$X5)
regresion

##
## Call:
## lm(formula = M1$X7 ~ M1$X5)
```

```

##  

## Coefficients:  

## (Intercept)      M1$X5  

##       0.4673     -0.3807  

CALCIO=summary(regresion)  

CALCIO  

##  

## Call:  

## lm(formula = M1$X7 ~ M1$X5)  

##  

## Residuals:  

##    Min     1Q Median     3Q    Max  

## -0.3261 -0.1961 -0.0642  0.1445  0.7130  

##  

## Coefficients:  

##              Estimate Std. Error t value Pr(>|t|)  

## (Intercept)  0.46730   0.04419 10.575 1.85e-14 ***  

## M1$X5        -0.38067   0.12189 -3.123  0.00295 **  

## ---  

## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1  

##  

## Residual standard error: 0.2446 on 51 degrees of freedom  

## Multiple R-squared:  0.1605, Adjusted R-squared:  0.1441  

## F-statistic: 9.754 on 1 and 51 DF,  p-value: 0.002948  

plot(M1$X5,M1$X7,col="blue",xlab="CALCIO",ylab="Concentracion de  

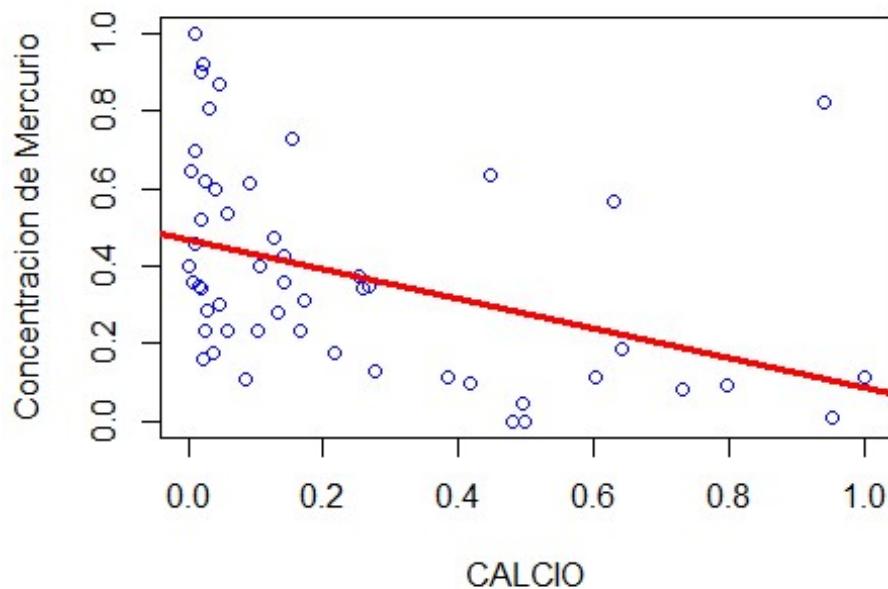
Mercurio",main="CALCIO vs. Concentracion de Mercurio")  

abline(regresion,col="red",lwd=3)  

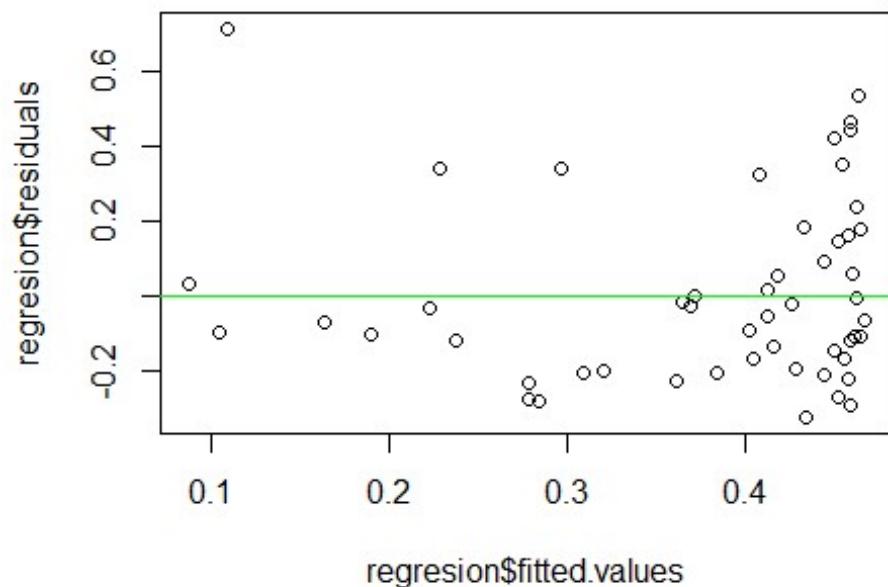
text(80,1.2,"B1=-0.005302 B0=0.726140")

```

CALCIO vs. Concentracion de Mercurio



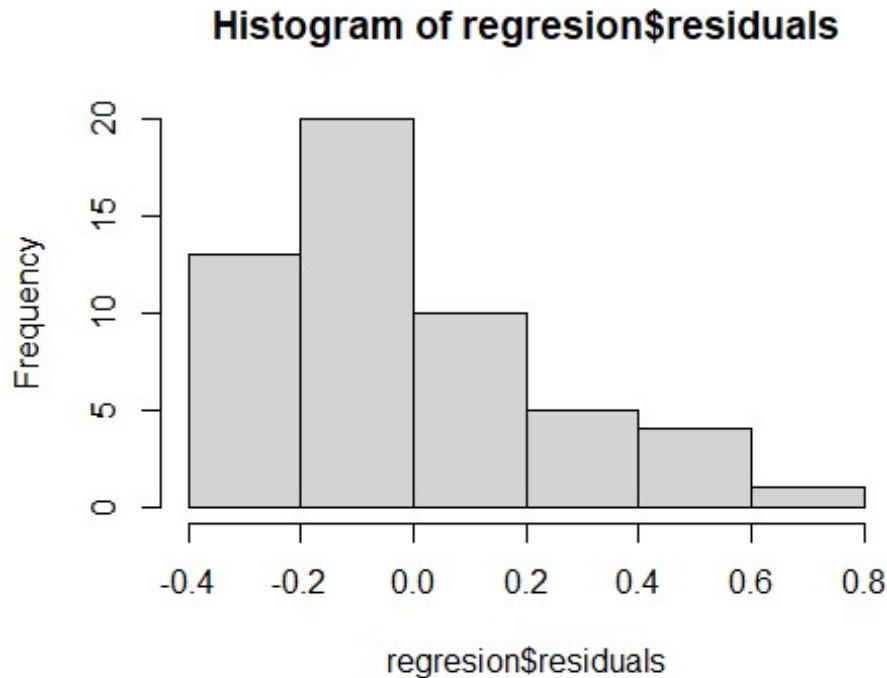
```
plot(regresion$fitted.values, regresion$residuals)
abline(h=0,col="green")
```



```
shapiro.test(regresion$residuals)

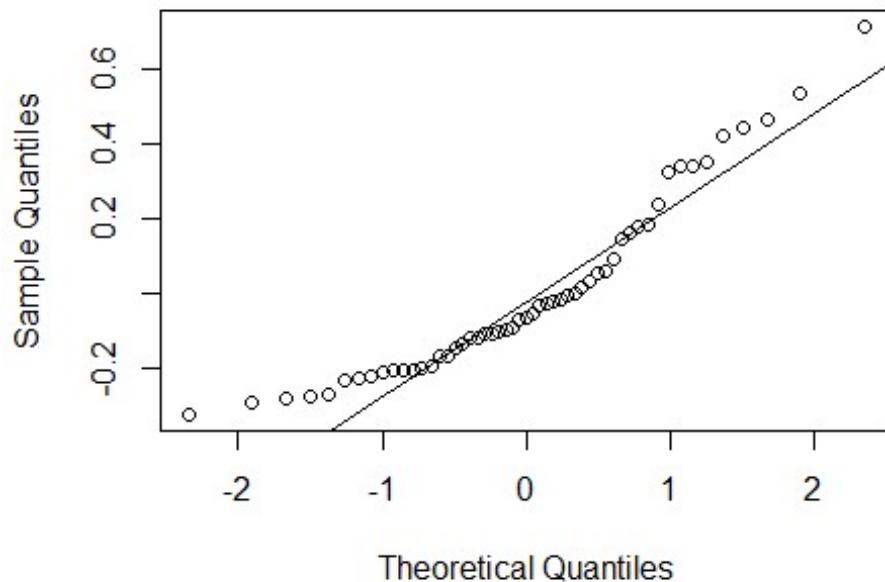
##
##  Shapiro-Wilk normality test
##
## data: regresion$residuals
## W = 0.90943, p-value = 0.0006884

hist(regresion$residuals)
```



```
qqnorm(regresion$residuals)
qqline(regresion$residuals)
```

Normal Q-Q Plot



```
t.test(regresion$residuals)

##
##  One Sample t-test
##
## data: regresion$residuals
## t = 9.756e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.06676394  0.06676394
## sample estimates:
##   mean of x
## 3.245958e-17

cor.test(M1$X7,CALCIOBC)

##
## Pearson's product-moment correlation
##
## data: M1$X7 and CALCIOBC
## t = -3.7845, df = 51, p-value = 0.0004064
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.6555727 -0.2266433
## sample estimates:
##   cor
## -0.4682519
```

```

regresion=lm(M1$X7 ~ CALCIOBC)
regresion

##
## Call:
## lm(formula = M1$X7 ~ CALCIOBC)
##
## Coefficients:
## (Intercept)      CALCIOBC
##          0.5159       -1.0357

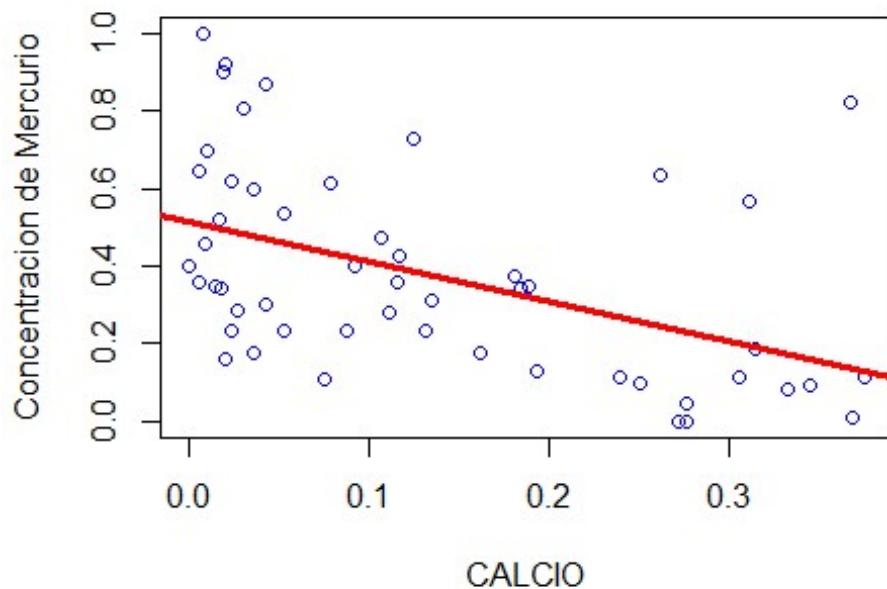
CALCIO=summary(regresion)
CALCIO

##
## Call:
## lm(formula = M1$X7 ~ CALCIOBC)
##
## Residuals:
##    Min     1Q Median     3Q    Max
## -0.3318 -0.1692 -0.0652  0.1192  0.6864
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)
## (Intercept)  0.51589   0.04883 10.566 1.91e-14 ***
## CALCIOBC    -1.03571   0.27367 -3.785 0.000406 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2359 on 51 degrees of freedom
## Multiple R-squared:  0.2193, Adjusted R-squared:  0.204
## F-statistic: 14.32 on 1 and 51 DF,  p-value: 0.0004064

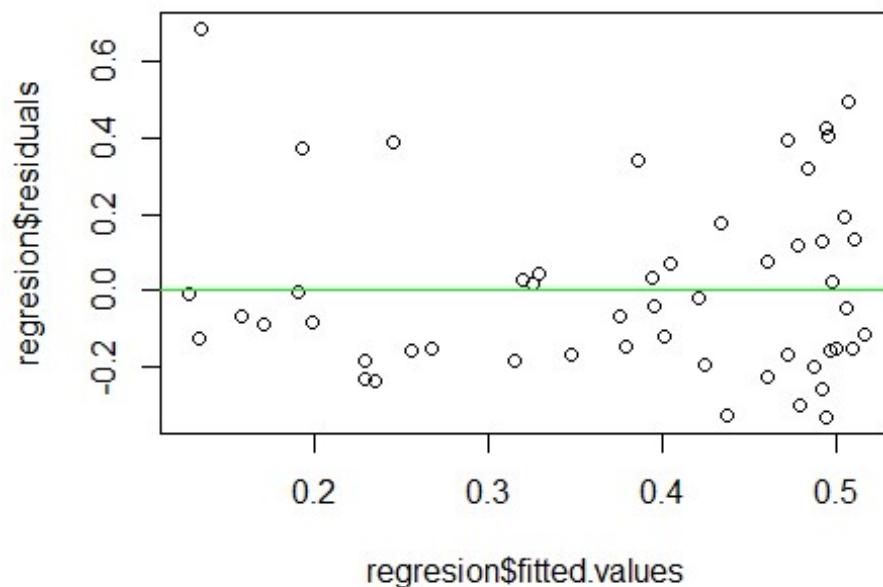
plot(CALCIOBC,M1$X7,col="blue",xlab="CALCIO",ylab="Concentracion de
Mercurio",main="CALCIO Box-Cox vs. Concentracion de Mercurio")
abline(regresion,col="red",lwd=3)
text(80,1.2,"B1=-0.005302 B0=0.726140")

```

CALCIO Box-Cox vs. Concentracion de Mercurio



```
plot(regresion$fitted.values, regresion$residuals)
abline(h=0,col="green")
```

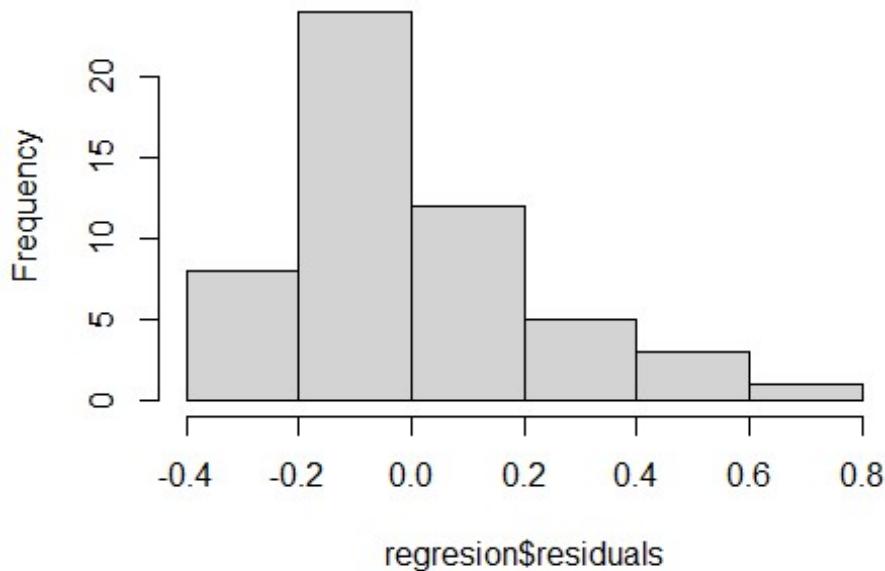


```
shapiro.test(regresion$residuals)

##
##  Shapiro-Wilk normality test
##
## data: regresion$residuals
## W = 0.91093, p-value = 0.0007785

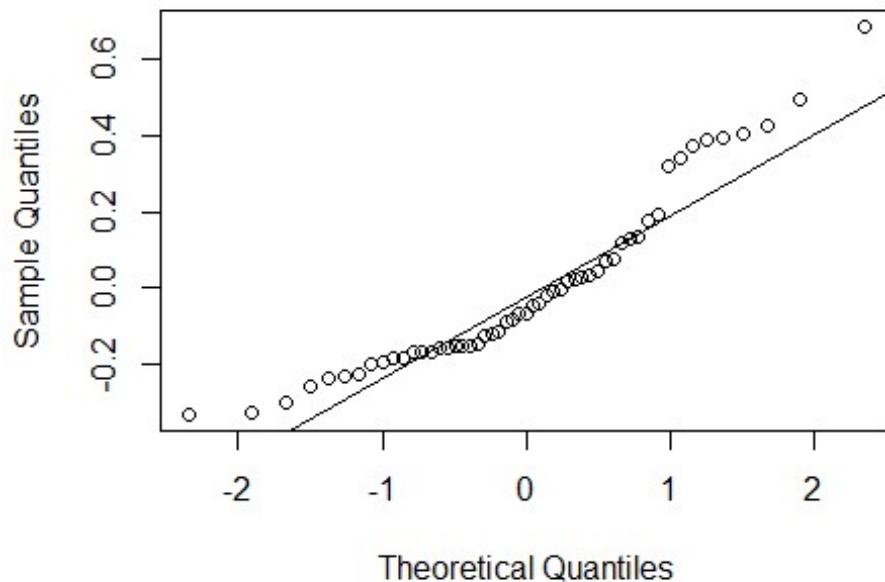
hist(regresion$residuals)
```

Histogram of regresion\$residuals



```
qqnorm(regresion$residuals)
qqline(regresion$residuals)
```

Normal Q-Q Plot



```
t.test(regresion$residuals)

##
##  One Sample t-test
##
## data: regresion$residuals
## t = 4.7755e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.06438672 0.06438672
## sample estimates:
##   mean of x
## 1.532305e-17

z1=CALCIOBC
z2=CALCIOBC^2
cor.test(M1$X7 , z1+ z2)

##
## Pearson's product-moment correlation
##
## data: M1$X7 and z1 + z2
## t = -3.6364, df = 51, p-value = 0.0006438
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.6449477 -0.2091075
## sample estimates:
```

```

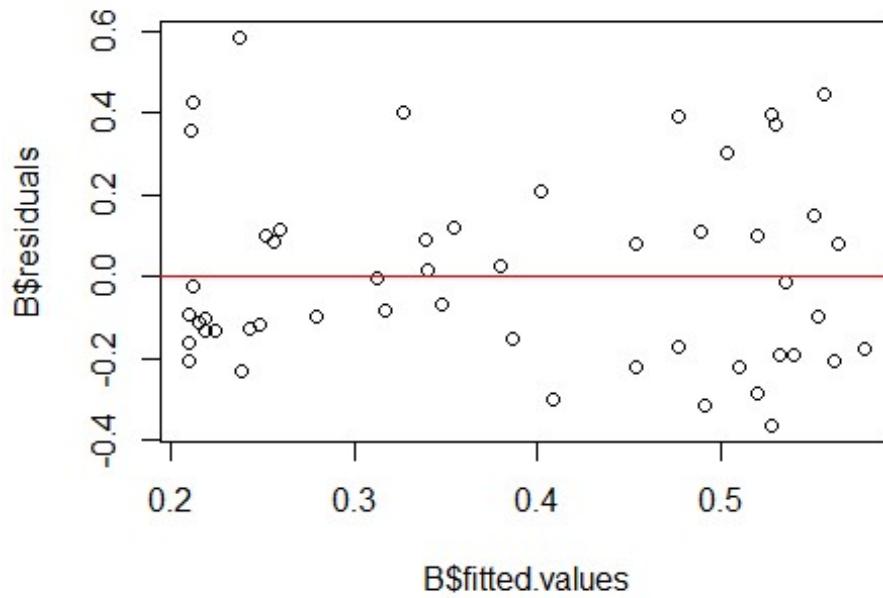
##          cor
## -0.4537549

B = lm(M1$X7 ~ z1+ z2)
summary(B)

##
## Call:
## lm(formula = M1$X7 ~ z1 + z2)
##
## Residuals:
##       Min     1Q Median     3Q    Max
## -0.36502 -0.17448 -0.08471  0.10698  0.58439
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.57887   0.06275  9.224 2.26e-12 ***
## z1         -2.57653   1.02104 -2.523  0.0148 *
## z2          4.48246   2.86473  1.565  0.1240
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2326 on 50 degrees of freedom
## Multiple R-squared:  0.2557, Adjusted R-squared:  0.2259
## F-statistic: 8.589 on 2 and 50 DF,  p-value: 0.0006218

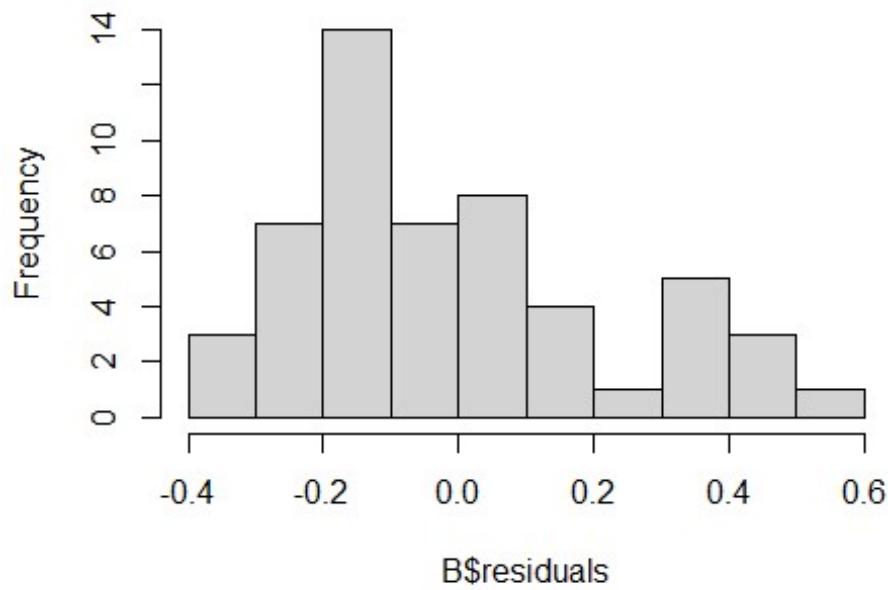
plot(B$fitted.values, B$residuals)
abline(h=0,col="red")

```



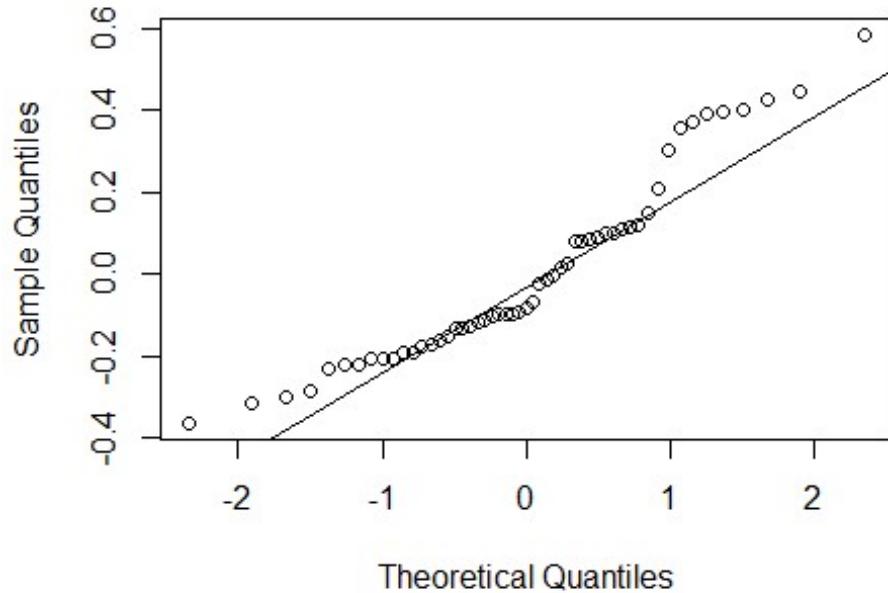
```
shapiro.test(B$residuals)
##
##  Shapiro-Wilk normality test
##
## data: B$residuals
## W = 0.92778, p-value = 0.003314
hist(B$residuals)
```

Histogram of B\$residuals



```
qqnorm(B$residuals)  
qqline(B$residuals)
```

Normal Q-Q Plot



```

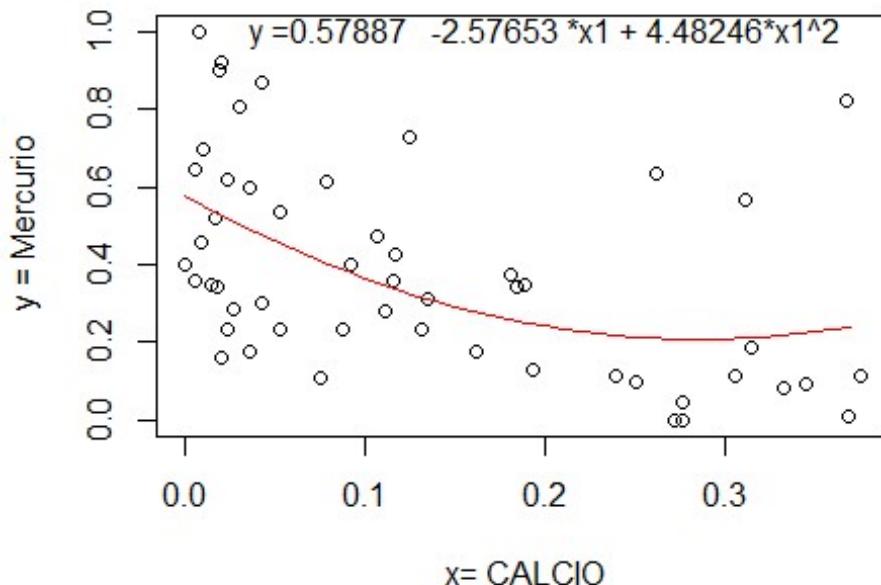
t.test(B$residuals)

##
##  One Sample t-test
##
## data: B$residuals
## t = 5.2817e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.06286597 0.06286597
## sample estimates:
##   mean of x
## 1.654687e-17

x=CALCIOBC
y=M1$X7
plot(x, y, main = "Modelo Cuadratico", xlab =" x= CALCIO", ylab =" y =
Mercurio")
x1 = seq(min(x), max(x), 0.01)
y1 = 0.57887 -2.57653 *x1 + 4.48246*x1^2
lines(x1, y1, col = "red")
text(0.2, 1, "y =0.57887 -2.57653 *x1 + 4.48246*x1^2")

```

Modelo Cuadratico



```

z1=CALCIOBC+1
z2=log(CALCIOBC+1)
cor.test(M1$X7 , log(CALCIOBC+1))

```

```

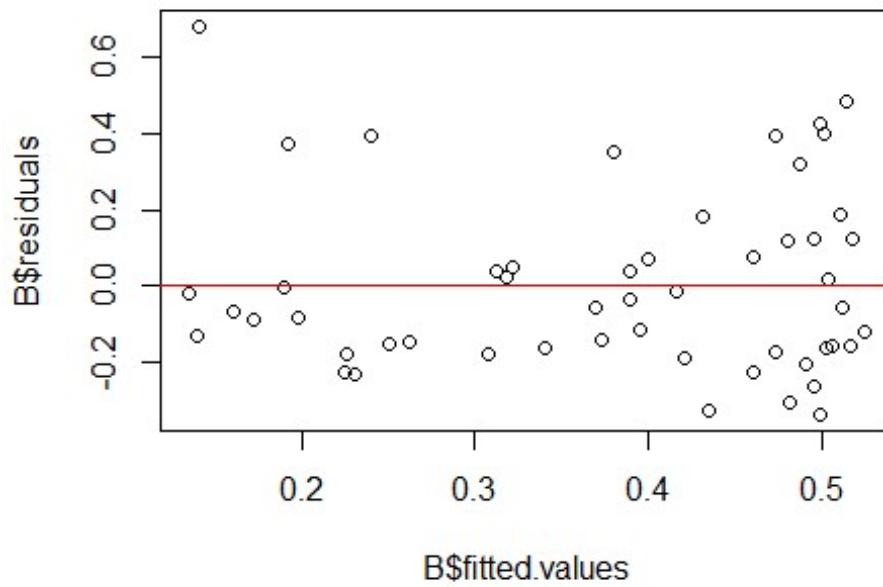
## 
## Pearson's product-moment correlation
## 
## data: M1$X7 and log(CALCIOBC + 1)
## t = -3.8589, df = 51, p-value = 0.0003216
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.6607747 -0.2353314
## sample estimates:
## cor
## -0.4753865

B = lm(M1$X7 ~ log(CALCIOBC+1))
summary(B)

##
## Call:
## lm(formula = M1$X7 ~ log(CALCIOBC + 1))
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.33687 -0.16234 -0.05925  0.11668  0.68017
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept)  0.5246    0.0499 10.512 2.29e-14 ***
## log(CALCIOBC + 1) -1.2240    0.3172 -3.859 0.000322 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2349 on 51 degrees of freedom
## Multiple R-squared:  0.226, Adjusted R-squared:  0.2108 
## F-statistic: 14.89 on 1 and 51 DF,  p-value: 0.0003216

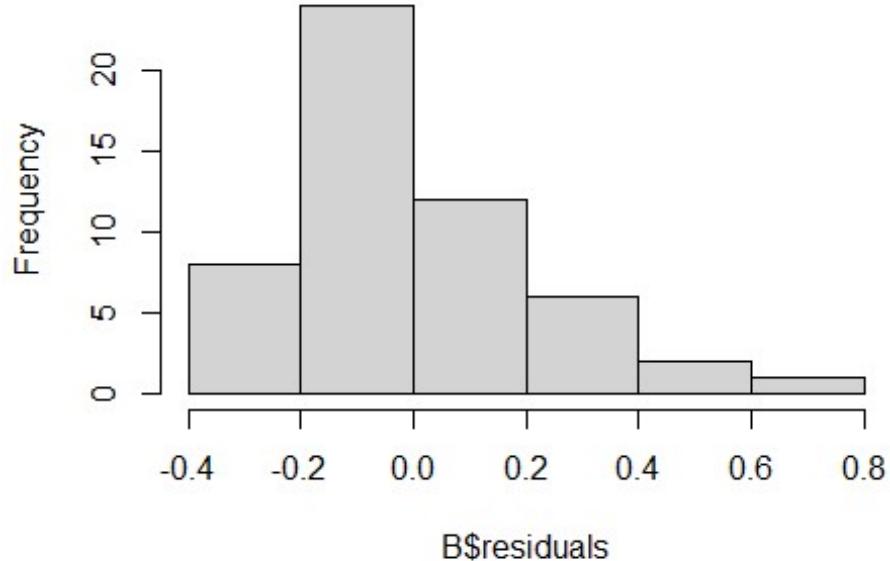
plot(B$fitted.values, B$residuals)
abline(h=0,col="red")

```



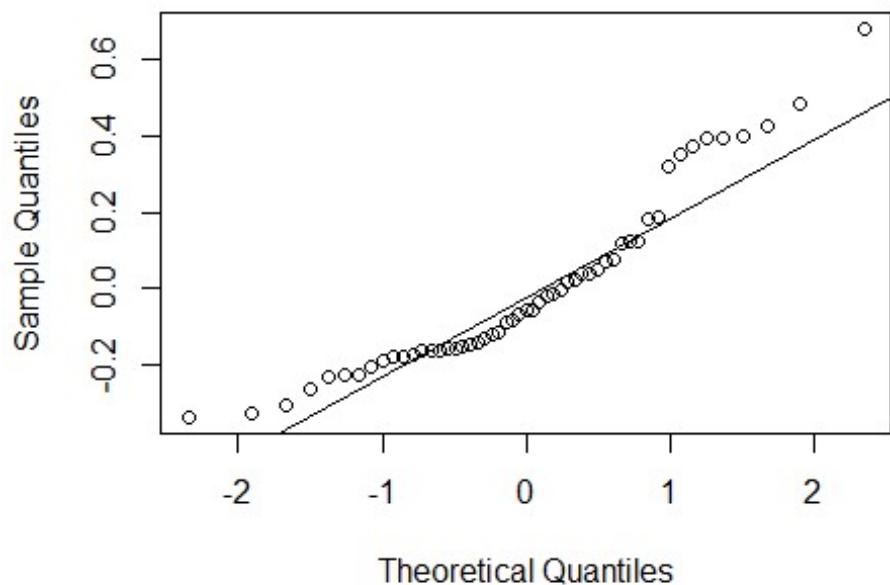
```
shapiro.test(B$residuals)
##
##  Shapiro-Wilk normality test
##
## data: B$residuals
## W = 0.91214, p-value = 0.0008609
hist(B$residuals)
```

Histogram of B\$residuals



```
qqnorm(B$residuals)  
qqline(B$residuals)
```

Normal Q-Q Plot



```

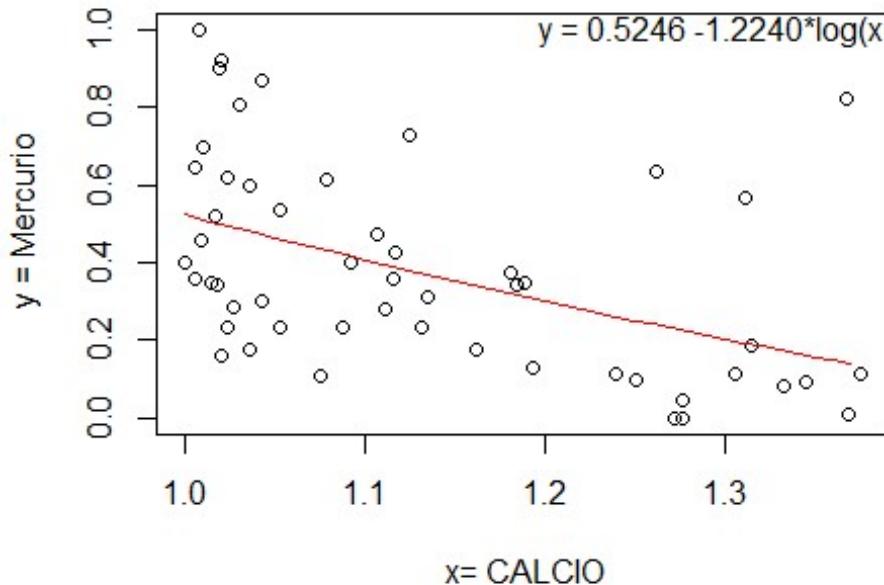
t.test(B$residuals)

##
##  One Sample t-test
##
## data: B$residuals
## t = 2.8711e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.06410851 0.06410851
## sample estimates:
##   mean of x
## 9.17276e-18

x=CALCIOBC+1
y=M1$X7
plot(x, y, main = "Modelo Logaritmico", xlab =" x= CALCIO", ylab =" y = Mercurio")
x1 = seq(min(x), max(x), 0.01)
y1 = 0.5246 -1.2240 *log(x1)
lines(x1, y1, col = "red")
text(1.3, 1, "y = 0.5246 -1.2240*log(x1)")

```

Modelo Logaritmico



Clorofila

```

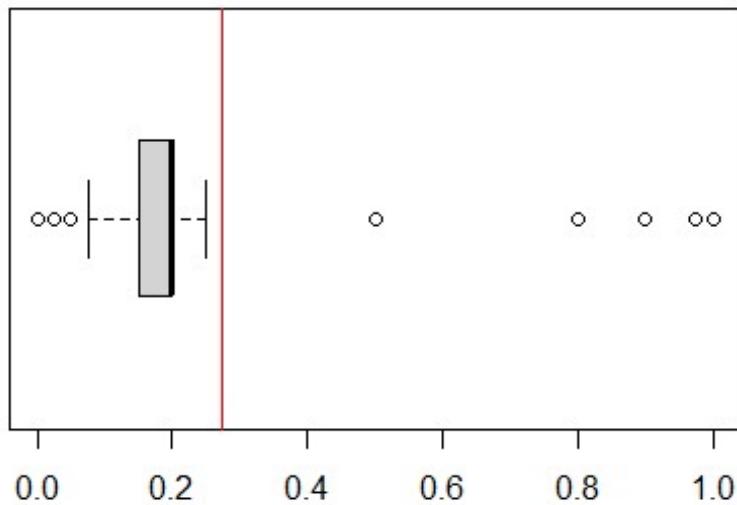
q1=quantile(M1$X8,0.25) #Cuantil 1 de la variable X
q2=quantile(M1$X8,0.5)

```

```

q3=quantile(M1$X8,0.75)
y1=min(M1$X8)
y2=max(M1$X8)
ri=IQR(M1$X8)
boxplot(M1$X8, horizontal=TRUE, ylim=c(y1,y2))
abline(v=q3+1.5*ri, col="red")

```

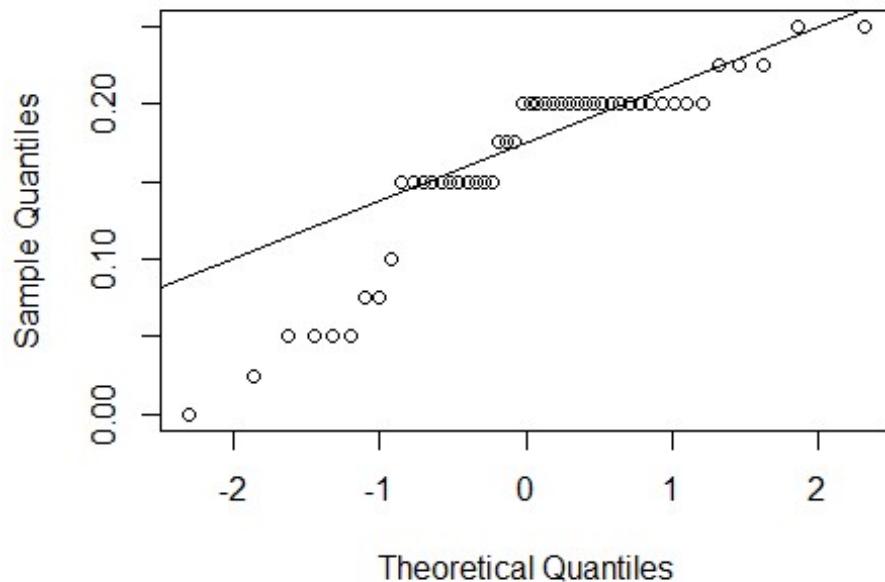


```

Clorofila= M1[M1$X8<q3+1.5*ri, c("X8")]
qqnorm(Clorofila)
qqline(Clorofila)

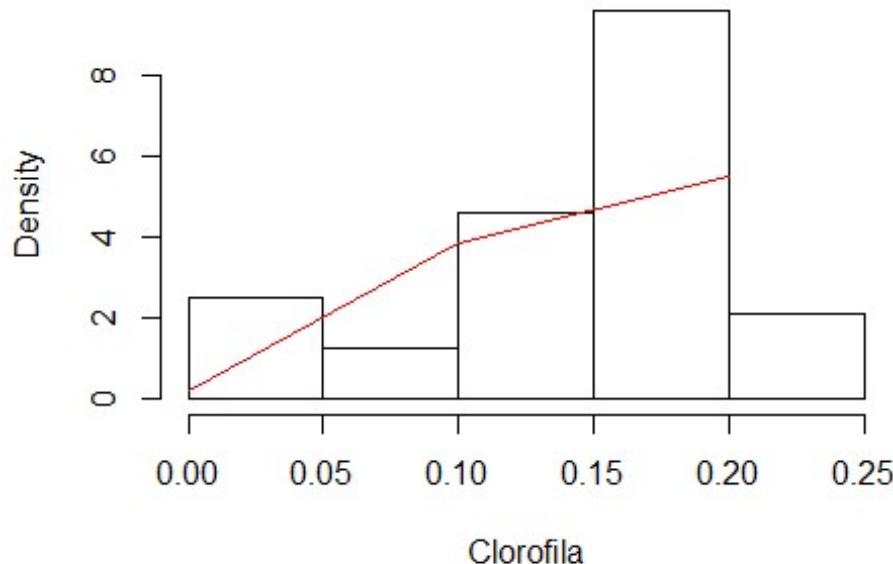
```

Normal Q-Q Plot



```
hist(Clorofila,prob=TRUE,col=0)
x=seq(min(Clorofila),max(Clorofila),0.1)
y=dnorm(x,mean(Clorofila),sd(Clorofila))
lines(x,y,col="red")
```

Histogram of Clorofila



```
library(moments)
skewness1=skewness(Clorofila)
cat("Sesgo: ",skewness1)

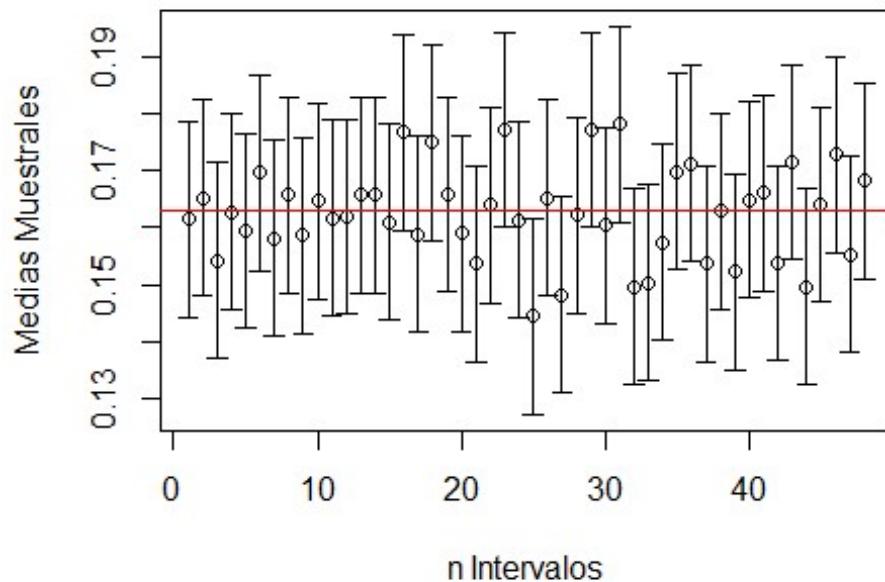
## Sesgo: -1.095579
cat("\n")

kurtosis1=kurtosis(Clorofila)
cat("Curtosis: ",kurtosis1)

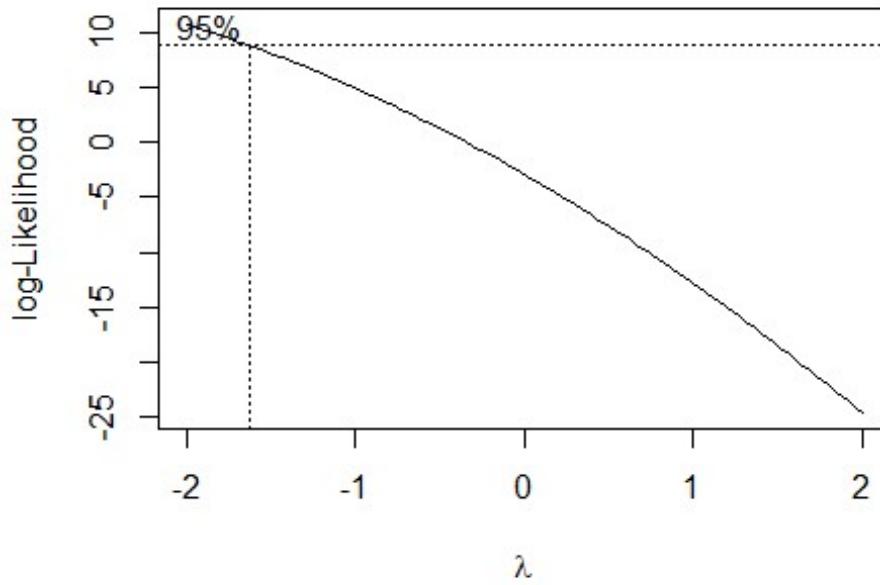
## Curtosis: 3.31411
cat("\n")

library(plotrix)
n=length(Clorofila)
media=mean(Clorofila)
DE=sd(Clorofila)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias
Muestrales")
abline(h=media,col="red")
```

Gráfico de IC



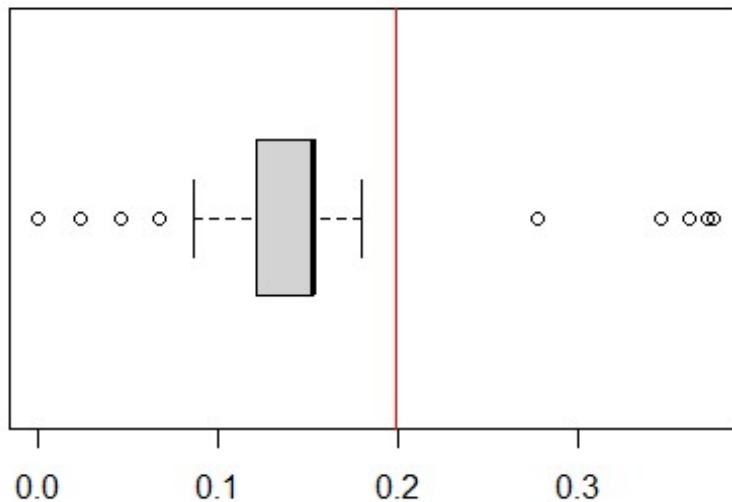
```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de:  0.1630208  +-  0.01713786
library(MASS)
minim=min(M1$X8)
b <- boxcox(lm((M1$X8+1) ~ 1))
```



```

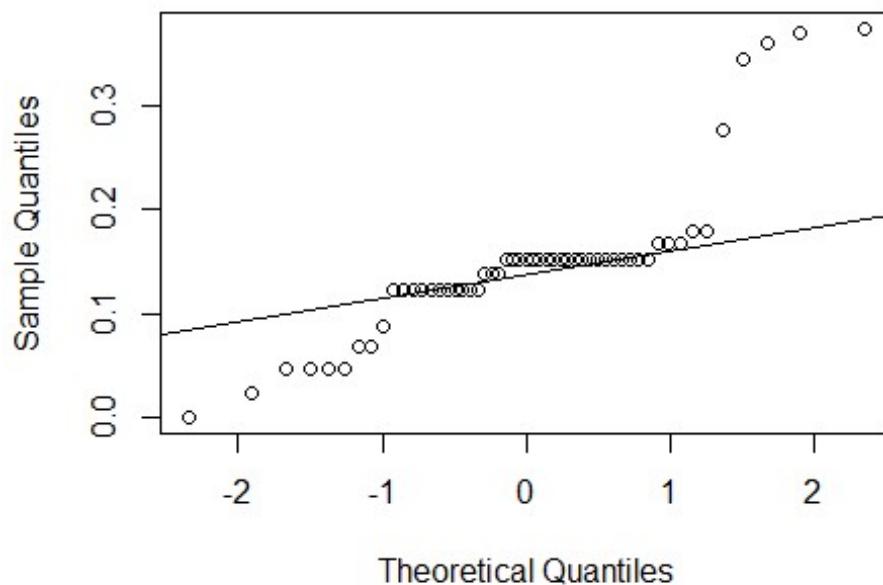
lambda <- b$x[which.max(b$y)]
X8<-(M1$X8+1)^lambda-1)/lambda
q1=quantile(X8,0.25) #Cuantil 1 de la variable X
q2=quantile(X8,0.5)
q3=quantile(X8,0.75)
y1=min(X8)
y2=max(X8)
ri=IQR(X8)
boxplot(X8, horizontal=TRUE, ylim=c(y1,y2))
abline(v=q3+1.5*ri, col="red")

```



```
ClorofilaBC = X8  
qqnorm(ClorofilaBC)  
qqline(ClorofilaBC)
```

Normal Q-Q Plot

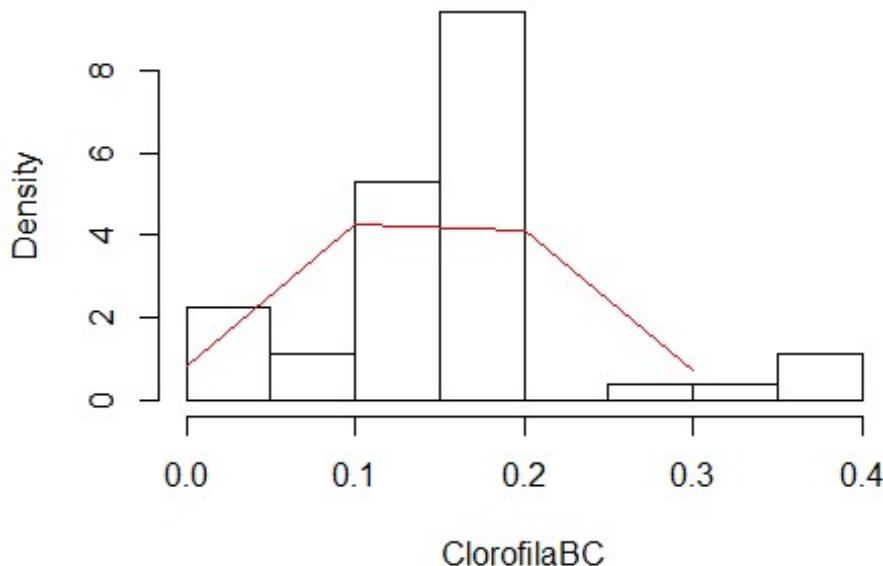


```

hist(ClorofilaBC,prob=TRUE,col=0)
x=seq(min(ClorofilaBC),max(ClorofilaBC),0.1)
y=dnorm(x,mean(ClorofilaBC),sd(ClorofilaBC))
lines(x,y,col="red")

```

Histogram of ClorofilaBC



```

library(moments)
skewness1=skewness(ClorofilaBC)
cat("Sesgo: ",skewness1)

## Sesgo: 1.351944

cat("\n")

kurtosis1=kurtosis(ClorofilaBC)
cat("Curtosis: ",kurtosis1)

## Curtosis: 5.70415

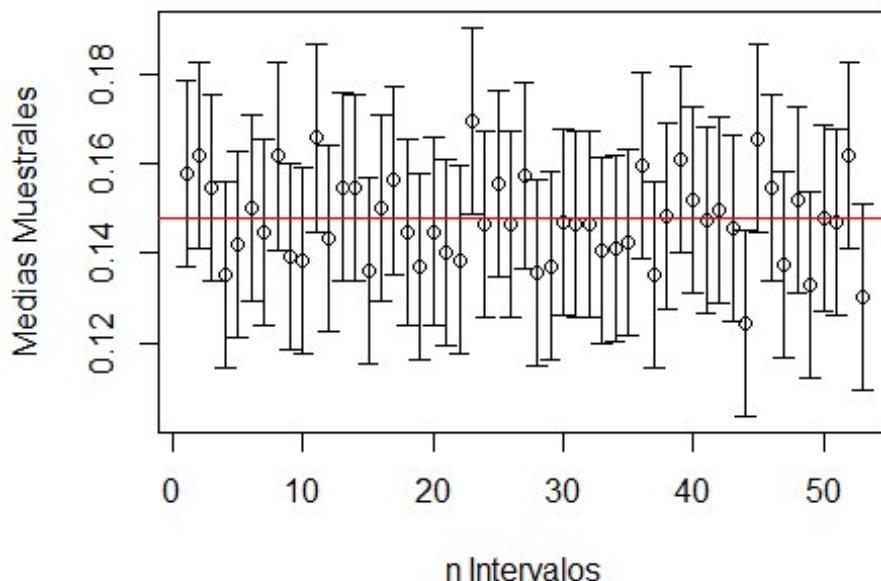
cat("\n")

library(plotrix)
n=length(ClorofilaBC)
media=mean(ClorofilaBC)
DE=sd(ClorofilaBC)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)

```

```
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias Muestrales")
abline(h=media,col="red")
```

Gráfico de IC



```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de:  0.1478106  +-  0.02077724
cor.test(M1$X7,M1$X8)

##
## Pearson's product-moment correlation
##
## data:  M1$X7 and M1$X8
## t = 0.56619, df = 51, p-value = 0.5737
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.1954345  0.3420216
## sample estimates:
##      cor
## 0.07903426

regresion=lm(M1$X7 ~ M1$X8)
regresion

##
## Call:
## lm(formula = M1$X7 ~ M1$X8)
```

```

##  

## Coefficients:  

## (Intercept)      M1$X8  

##       0.35555     0.09763  

Clorofila=summary(regresion)  

Clorofila  

##  

## Call:  

## lm(formula = M1$X7 ~ M1$X8)  

##  

## Residuals:  

##      Min       1Q   Median       3Q      Max  

## -0.36488 -0.20166 -0.02911  0.20546  0.63713  

##  

## Coefficients:  

##             Estimate Std. Error t value Pr(>|t|)  

## (Intercept)  0.35555   0.05348   6.648 1.96e-08 ***  

## M1$X8       0.09763   0.17243   0.566   0.574  

## ---  

## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1  

##  

## Residual standard error: 0.2661 on 51 degrees of freedom  

## Multiple R-squared:  0.006246,  Adjusted R-squared:  -0.01324  

## F-statistic: 0.3206 on 1 and 51 DF,  p-value: 0.5737  

plot(M1$X8,M1$X7,col="blue",xlab="Clorofila",ylab="Concentracion de  

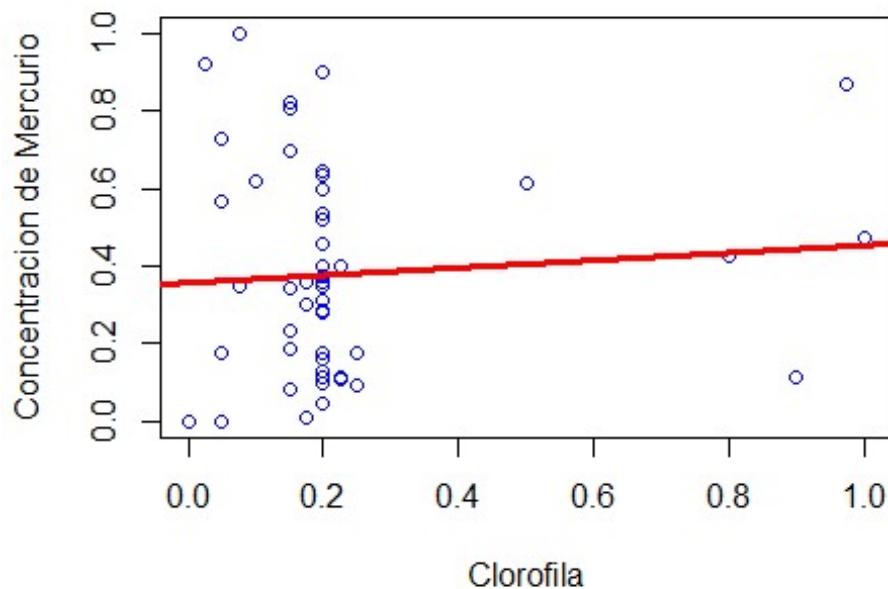
Mercurio",main="Clorofila vs. Concentracion de Mercurio")  

abline(regresion,col="red",lwd=3)  

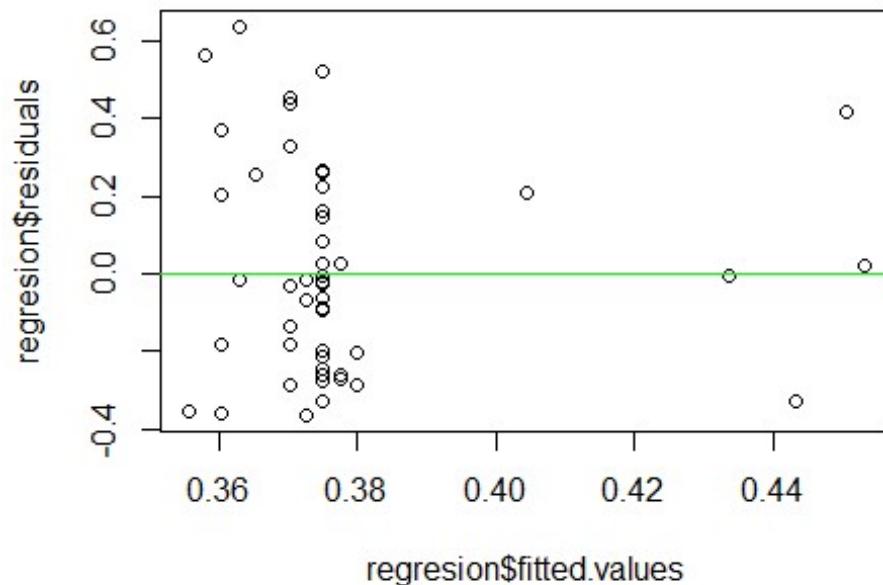
text(80,1.2,"B1=-0.005302 B0=0.726140")

```

Clorofila vs. Concentracion de Mercurio



```
plot(regresion$fitted.values, regresion$residuals)
abline(h=0,col="green")
```

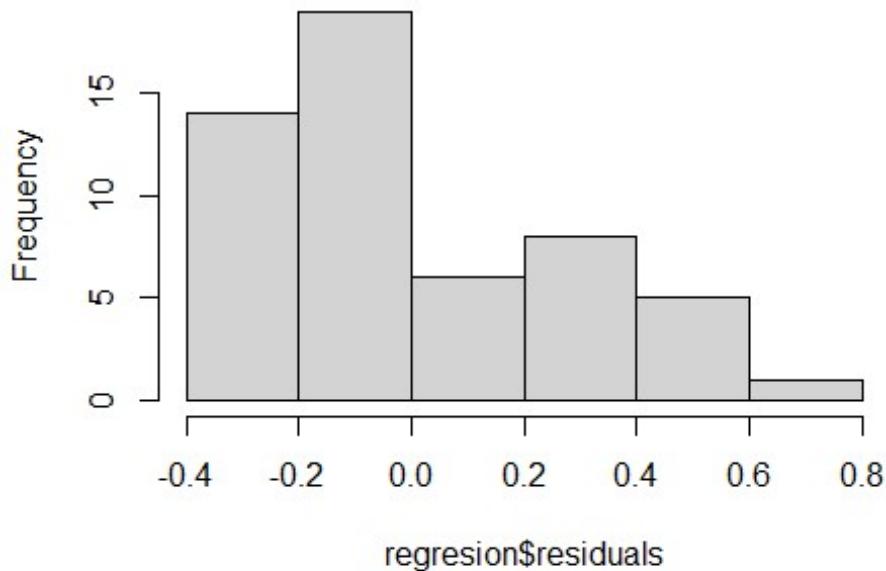


```
shapiro.test(regresion$residuals)

##
##  Shapiro-Wilk normality test
##
## data: regresion$residuals
## W = 0.93925, p-value = 0.009517

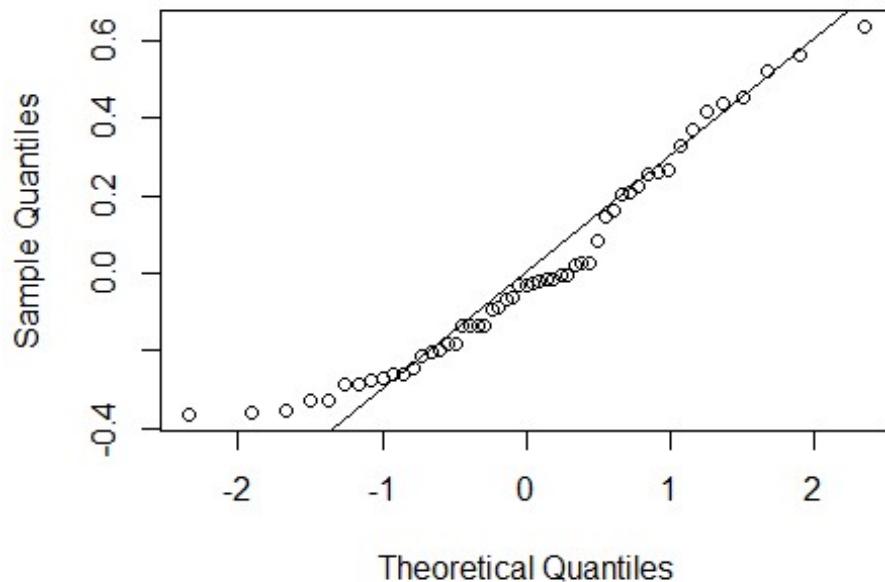
hist(regresion$residuals)
```

Histogram of regresion\$residuals



```
qqnorm(regresion$residuals)
qqline(regresion$residuals)
```

Normal Q-Q Plot



```
t.test(regresion$residuals)

##
##  One Sample t-test
##
## data: regresion$residuals
## t = -5.8417e-17, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.0726411  0.0726411
## sample estimates:
##   mean of x
## -2.114706e-18

cor.test(M1$X7,ClorofilaBC)

##
## Pearson's product-moment correlation
##
## data: M1$X7 and ClorofilaBC
## t = 0.15268, df = 51, p-value = 0.8793
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.2503659  0.2899928
## sample estimates:
##   cor
## 0.02137436
```

```

regresion=lm(M1$X7 ~ ClorofilaBC)
regresion

##
## Call:
## lm(formula = M1$X7 ~ ClorofilaBC)
##
## Coefficients:
## (Intercept) ClorofilaBC
##      0.36683      0.07322

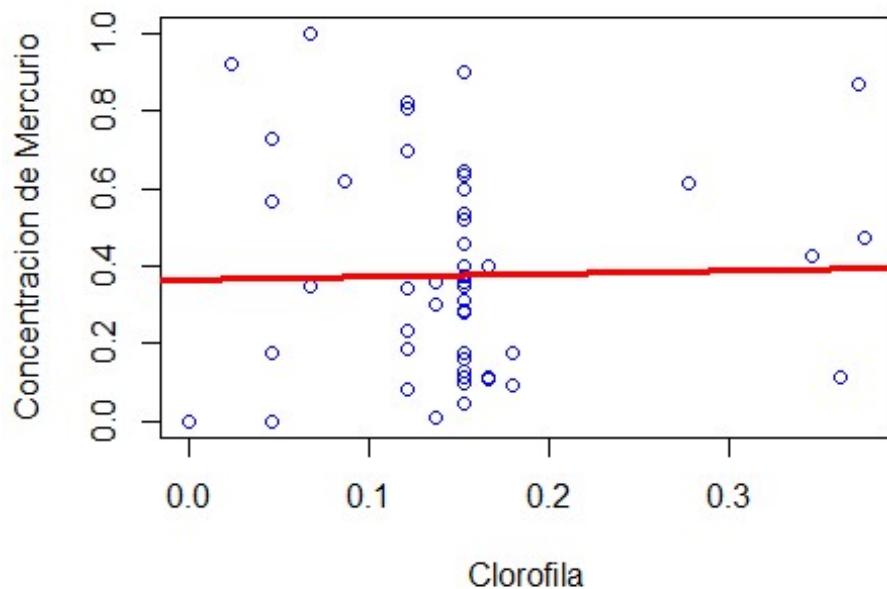
Clorofila=summary(regresion)
Clorofila

##
## Call:
## lm(formula = M1$X7 ~ ClorofilaBC)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.37023 -0.20171 -0.03467  0.19566  0.62824
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)
## (Intercept)  0.36683   0.07980   4.597 2.86e-05 ***
## ClorofilaBC  0.07322   0.47957   0.153    0.879
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2669 on 51 degrees of freedom
## Multiple R-squared:  0.0004569, Adjusted R-squared:  -0.01914
## F-statistic: 0.02331 on 1 and 51 DF,  p-value: 0.8793

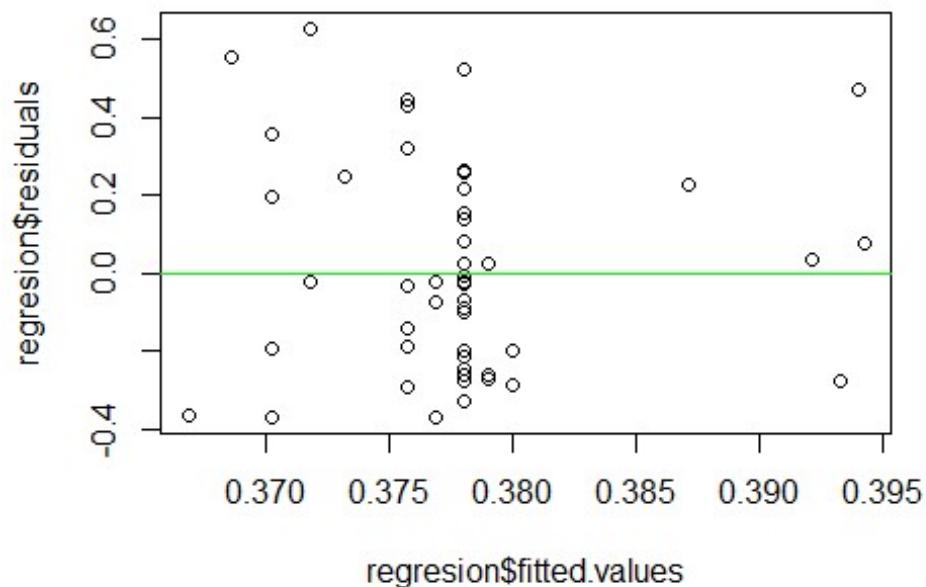
plot(ClorofilaBC,M1$X7,col="blue",xlab="Clorofila",ylab="Concentracion de
Mercurio",main="Clorofila Box-Cox vs. Concentracion de Mercurio")
abline(regresion,col="red",lwd=3)
text(80,1.2,"B1=-0.005302 B0=0.726140")

```

Clorofila Box-Cox vs. Concentracion de Mercurio



```
plot(regresion$fitted.values, regresion$residuals)
abline(h=0,col="green")
```

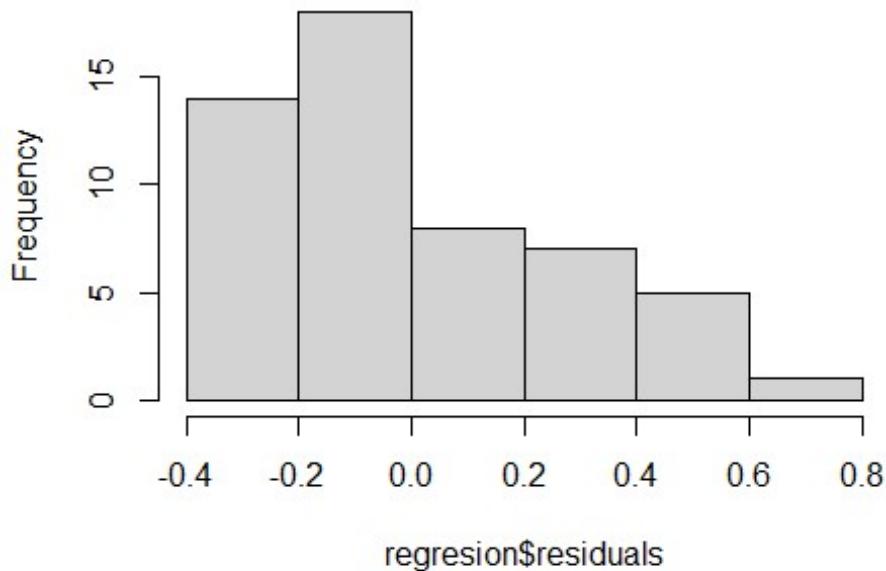


```
shapiro.test(regresion$residuals)

##
##  Shapiro-Wilk normality test
##
## data: regresion$residuals
## W = 0.94026, p-value = 0.01047

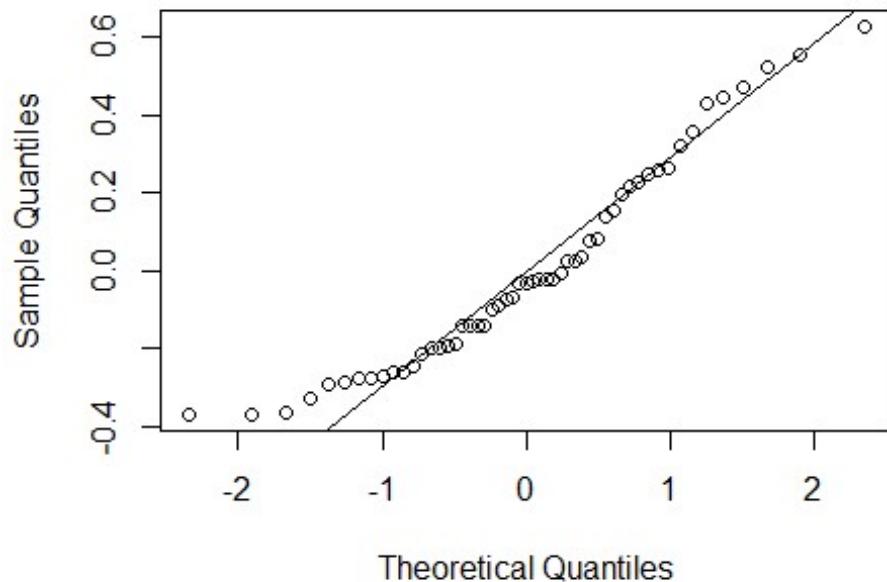
hist(regresion$residuals)
```

Histogram of regresion\$residuals



```
qqnorm(regresion$residuals)
qqline(regresion$residuals)
```

Normal Q-Q Plot



```
t.test(regresion$residuals)

##
##  One Sample t-test
##
##  data: regresion$residuals
##  t = 1.3671e-16, df = 52, p-value = 1
##  alternative hypothesis: true mean is not equal to 0
##  95 percent confidence interval:
##  -0.07285239  0.07285239
##  sample estimates:
##  mean of x
##  4.963293e-18

z1=ClorofilaBC
z2=ClorofilaBC^2
cor.test(M1$X7 , z1+ z2)

##
##  Pearson's product-moment correlation
##
##  data: M1$X7 and z1 + z2
##  t = 0.27137, df = 51, p-value = 0.7872
##  alternative hypothesis: true correlation is not equal to 0
##  95 percent confidence interval:
##  -0.2347315  0.3051335
##  sample estimates:
```

```

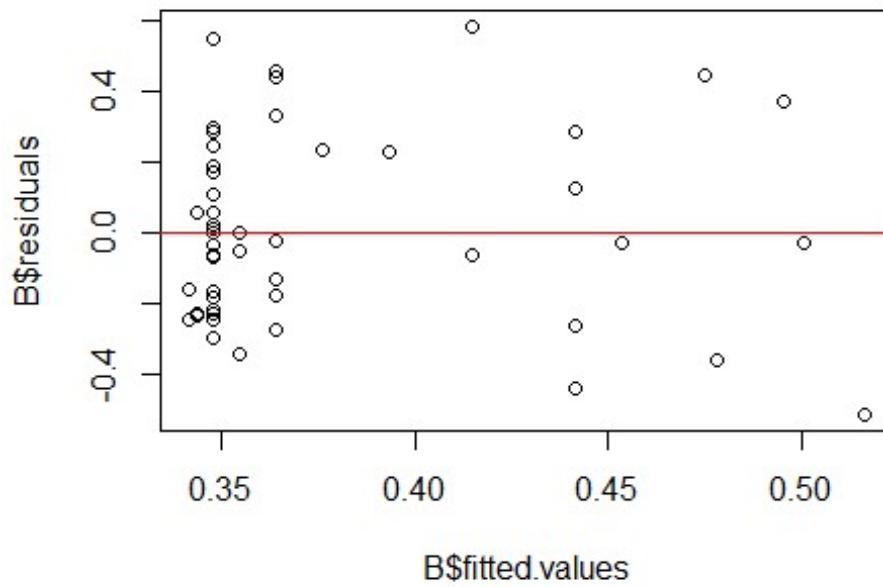
##          cor
## 0.03797145

B = lm(M1$X7 ~ z1+ z2)
summary(B)

##
## Call:
## lm(formula = M1$X7 ~ z1 + z2)
##
## Residuals:
##       Min     1Q Median     3Q    Max
## -0.51630 -0.18497 -0.02794  0.18713  0.58548
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)
## (Intercept)  0.5163    0.1396   3.698  0.00054 ***
## z1          -1.8332    1.5413  -1.189  0.23992
## z2           4.7783    3.6742   1.301  0.19938
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2651 on 50 degrees of freedom
## Multiple R-squared:  0.03316,   Adjusted R-squared:  -0.005511
## F-statistic: 0.8575 on 2 and 50 DF,  p-value: 0.4304

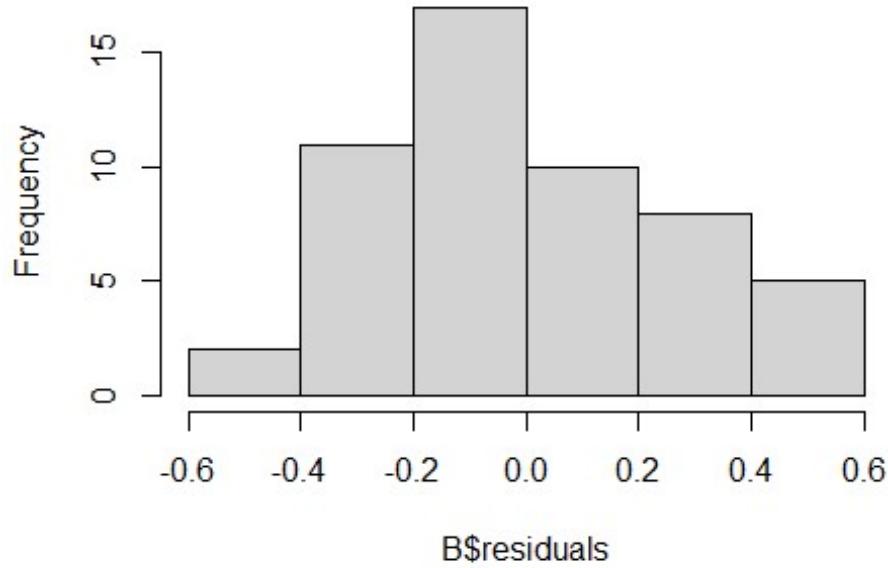
plot(B$fitted.values, B$residuals)
abline(h=0,col="red")

```



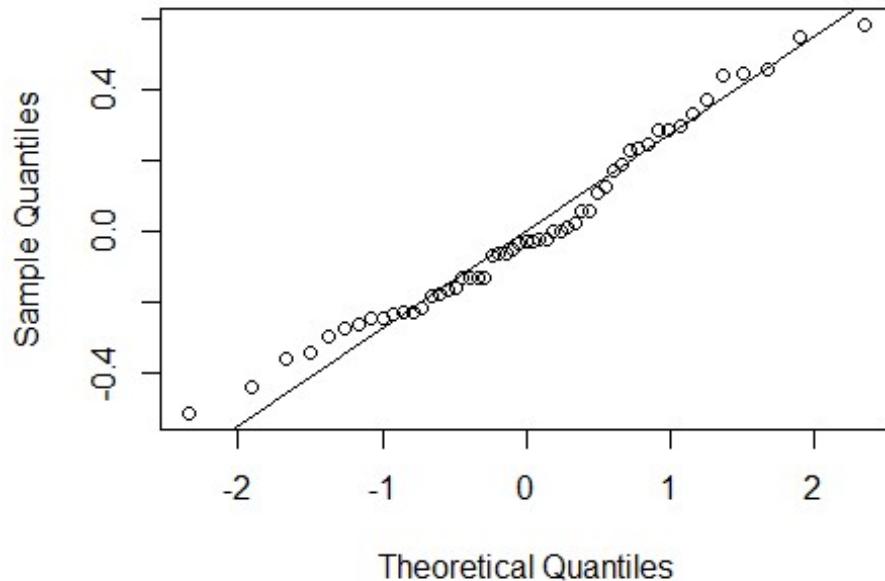
```
shapiro.test(B$residuals)
##
##  Shapiro-Wilk normality test
##
## data: B$residuals
## W = 0.97045, p-value = 0.2111
hist(B$residuals)
```

Histogram of B\$residuals



```
qqnorm(B$residuals)  
qqline(B$residuals)
```

Normal Q-Q Plot



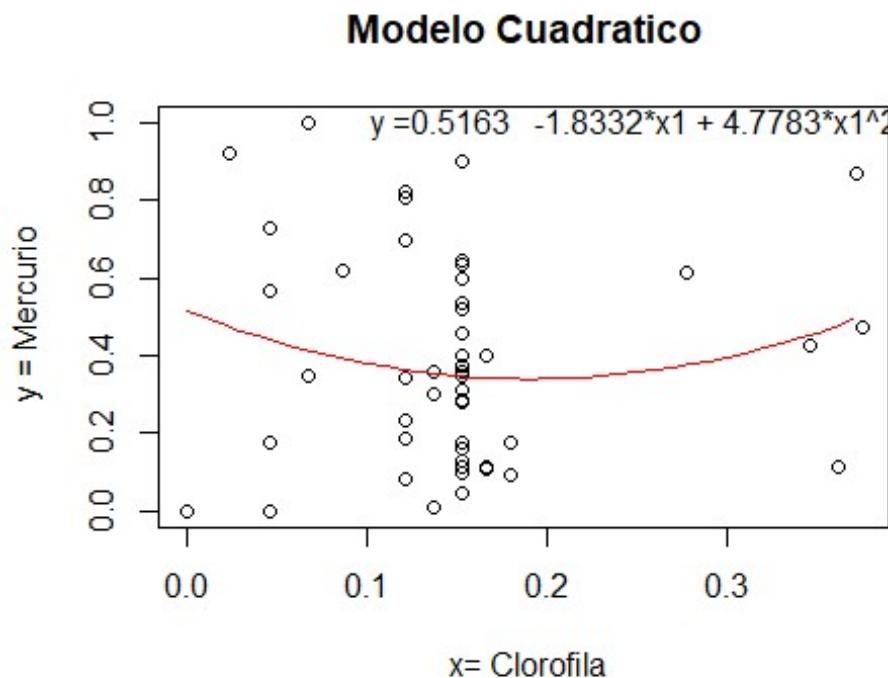
```

t.test(B$residuals)

##
##  One Sample t-test
##
## data: B$residuals
## t = 4.4509e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.07165059 0.07165059
## sample estimates:
##   mean of x
## 1.589277e-17

x=ClorofilaBC
y=M1$X7
plot(x, y, main = "Modelo Cuadratico", xlab =" x= Clorofila", ylab =" y = Mercurio")
x1 = seq(min(x), max(x), 0.01)
y1 = 0.5163 -1.8332*x1 + 4.7783*x1^2
lines(x1, y1, col = "red")
text(0.25, 1, "y =0.5163 -1.8332*x1 + 4.7783*x1^2")

```



```

z1=ClorofilaBC+1
z2=log(ClorofilaBC+1)
cor.test(M1$X7,log(ClorofilaBC+1))

```

```

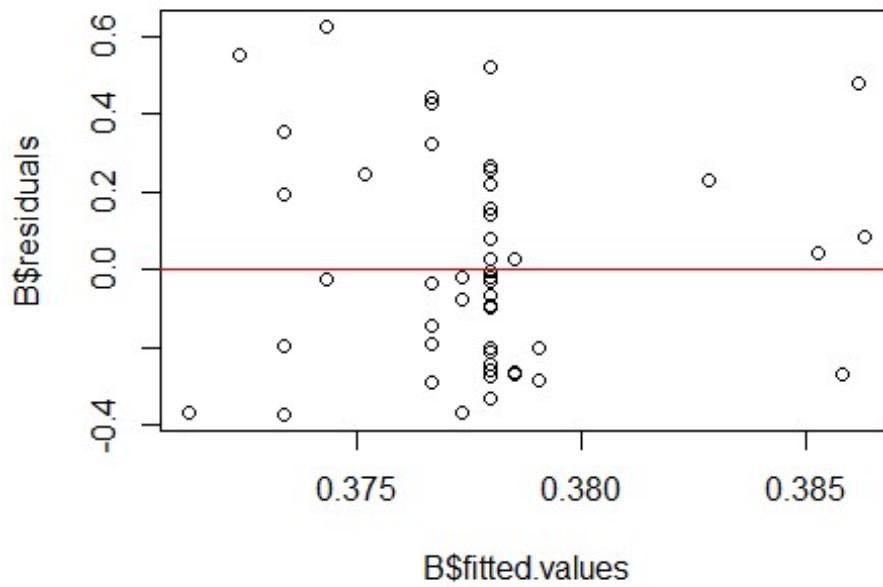
## 
## Pearson's product-moment correlation
## 
## data: M1$X7 and log(ClorofilaBC + 1)
## t = 0.083013, df = 51, p-value = 0.9342
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.2594857 0.2810342
## sample estimates:
## cor
## 0.01162333

B = lm(M1$X7 ~ log(ClorofilaBC+1))
summary(B)

##
## Call:
## lm(formula = M1$X7 ~ log(ClorofilaBC + 1))
##
## Residuals:
##      Min        1Q    Median        3Q       Max
## -0.37337 -0.20077 -0.03558  0.19252  0.62569
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept) 0.37122   0.08575  4.329 7.01e-05 ***
## log(ClorofilaBC + 1) 0.04740   0.57104  0.083   0.934  
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2669 on 51 degrees of freedom
## Multiple R-squared:  0.0001351, Adjusted R-squared:  -0.01947 
## F-statistic: 0.006891 on 1 and 51 DF,  p-value: 0.9342

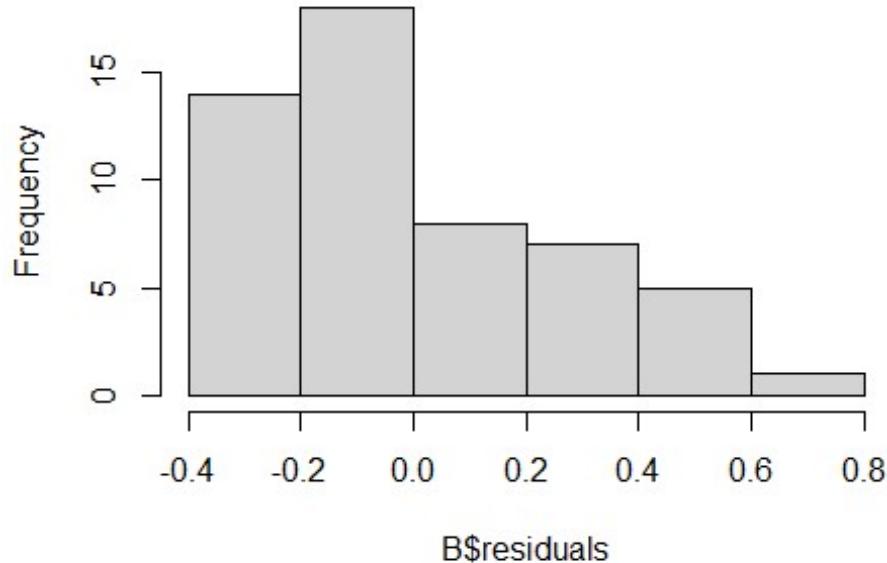
plot(B$fitted.values, B$residuals)
abline(h=0,col="red")

```



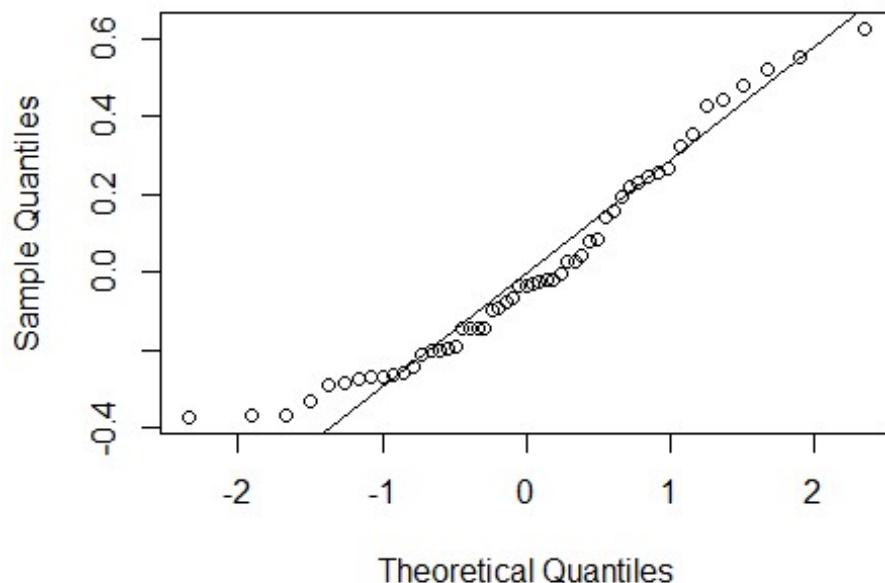
```
shapiro.test(B$residuals)
##
##  Shapiro-Wilk normality test
##
## data: B$residuals
## W = 0.94104, p-value = 0.01127
hist(B$residuals)
```

Histogram of B\$residuals



```
qqnorm(B$residuals)  
qqline(B$residuals)
```

Normal Q-Q Plot



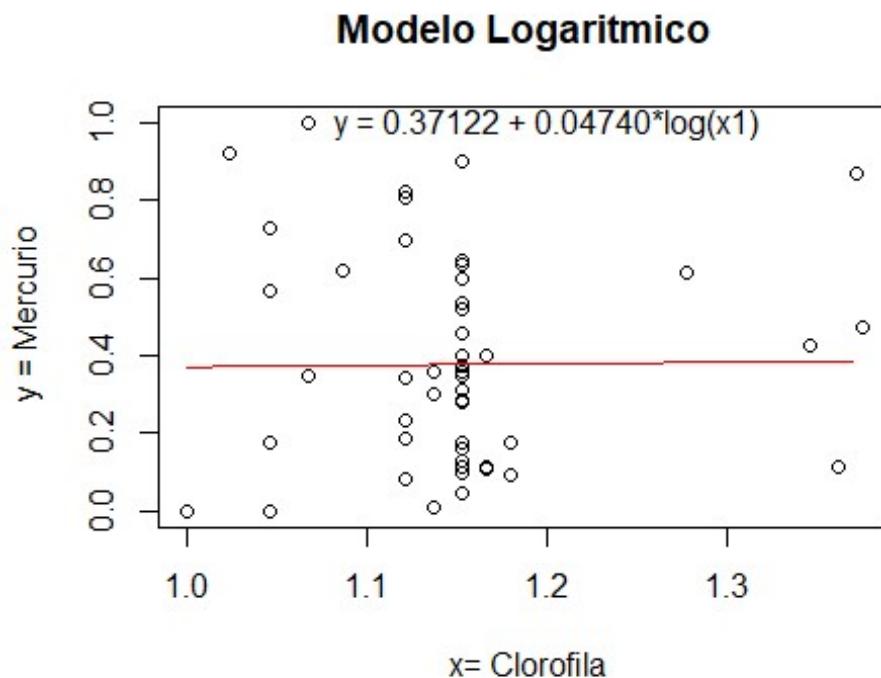
```

t.test(B$residuals)

##
##  One Sample t-test
##
## data: B$residuals
## t = 5.4407e-17, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.07286412 0.07286412
## sample estimates:
## mean of x
## 1.9756e-18

x=ClorofilaBC+1
y=M1$X7
plot(x, y, main = "Modelo Logaritmico", xlab =" x= Clorofila", ylab =" y = Mercurio")
x1 = seq(min(x), max(x), 0.01)
y1 = 0.37122 + 0.04740*log(x1)
lines(x1, y1, col = "red")
text(1.2, 1, "y = 0.37122 + 0.04740*log(x1)")

```



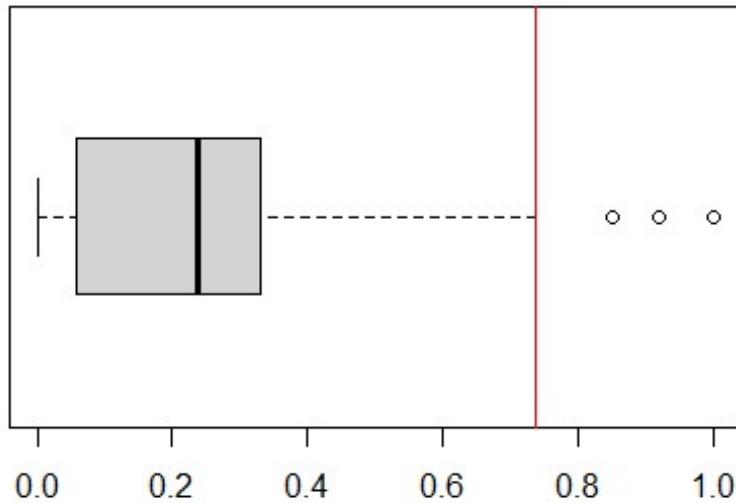
N_peces

```

q1=quantile(M1$X9,0.25) #Cuartil 1 de la variable X
q2=quantile(M1$X9,0.5)

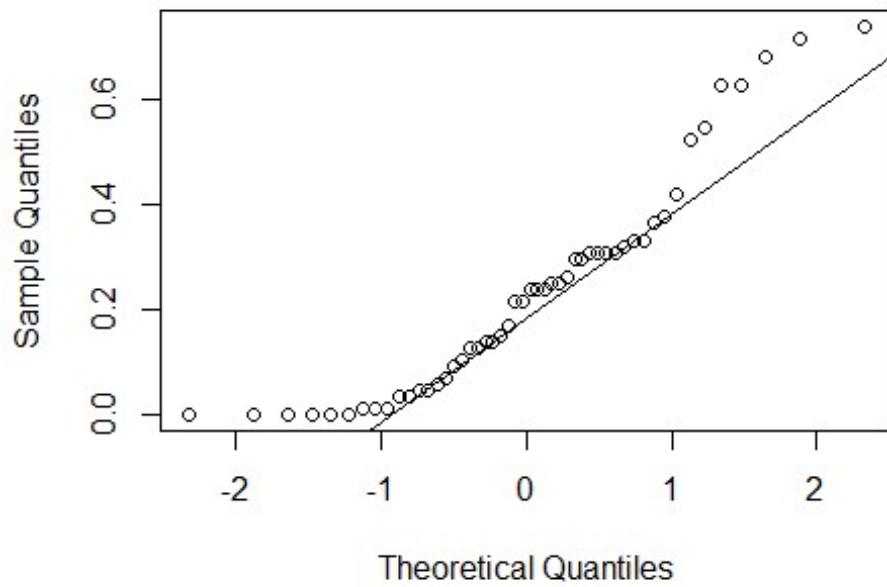
```

```
q3=quantile(M1$X9,0.75)
y1=min(M1$X9)
y2=max(M1$X9)
ri=IQR(M1$X9)
boxplot(M1$X9, horizontal=TRUE, ylim=c(y1,y2))
abline(v=q3+1.5*ri, col="red")
```



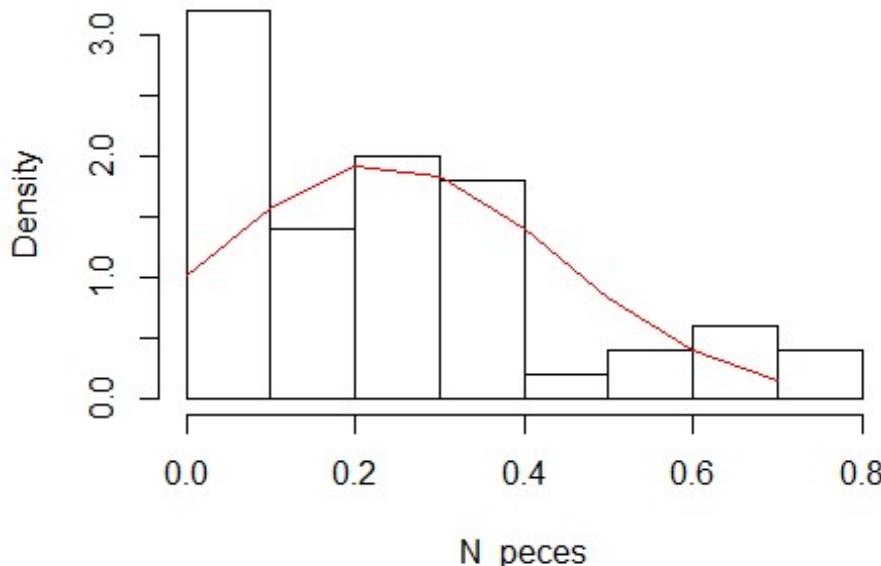
```
N_peces= M1[M1$X9< q3+1.5*ri, c("X9")]
qqnorm(N_peces)
qqline(N_peces)
```

Normal Q-Q Plot



```
hist(N_peces, prob=TRUE, col=0)
x=seq(min(N_peces), max(N_peces), 0.1)
y=dnorm(x, mean(N_peces), sd(N_peces))
lines(x,y, col="red")
```

Histogram of N_peces



```
library(moments)
skewness1=skewness(N_peces)
cat("Sesgo: ",skewness1)

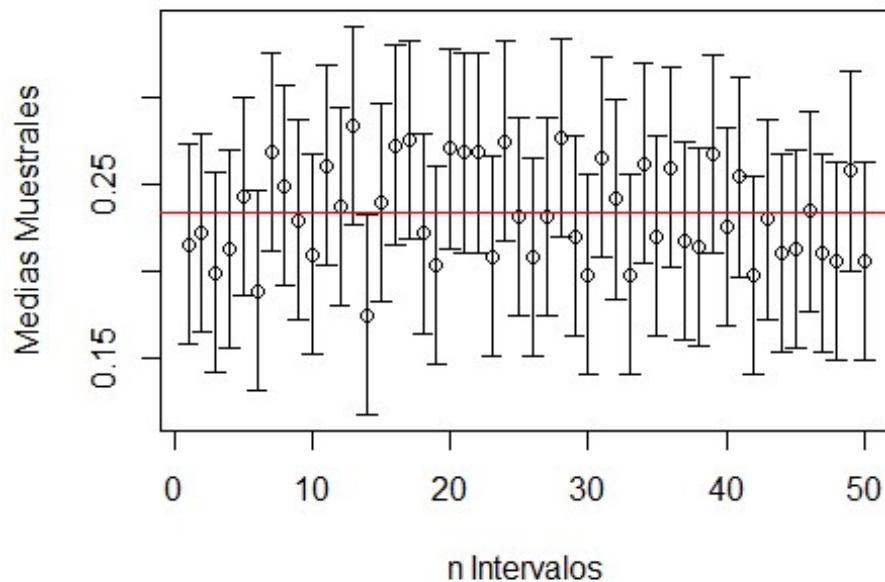
## Sesgo:  0.8566714
cat("\n")

kurtosis1=kurtosis(N_peces)
cat("Curtosis: ",kurtosis1)

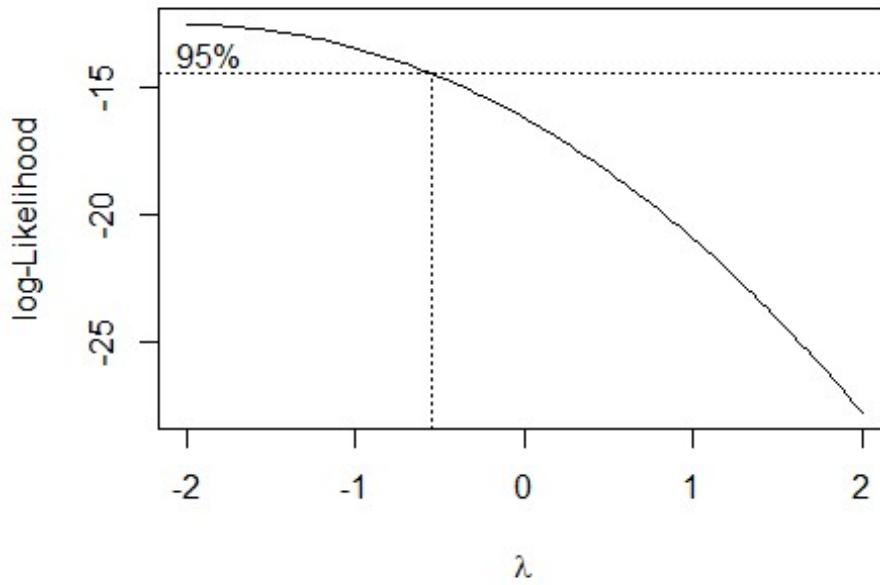
## Curtosis:  2.995464
cat("\n")

library(plotrix)
n=length(N_peces)
media=mean(N_peces)
DE=sd(N_peces)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias
Muestrales")
abline(h=media,col="red")
```

Gráfico de IC



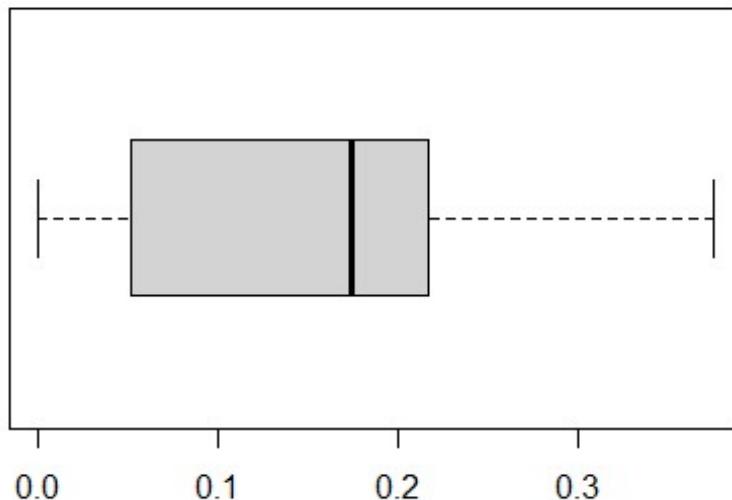
```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de:  0.2334091  +-  0.05711311
library(MASS)
minim=min(M1$X9)
b <- boxcox(lm((M1$X9+1) ~ 1))
```



```

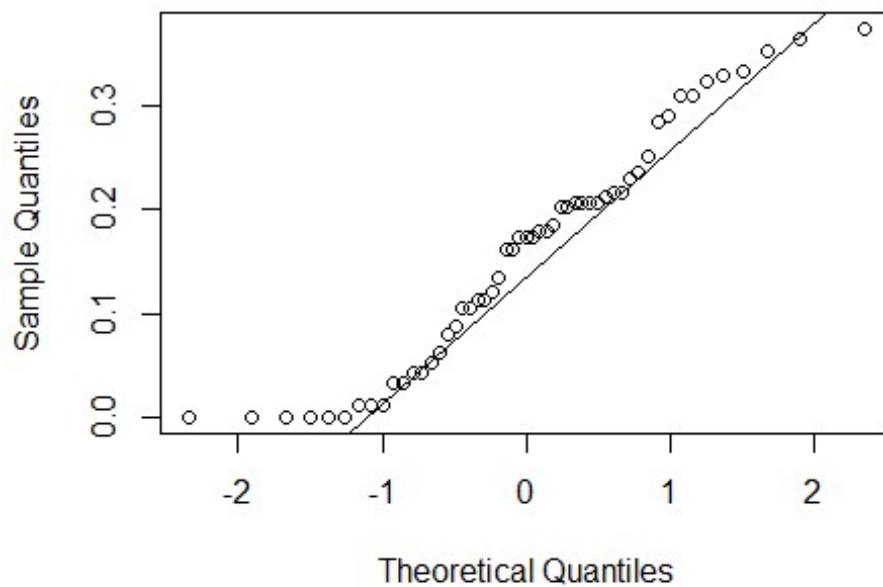
lambda <- b$x[which.max(b$y)]
X9<-(M1$X9+1)^lambda-1)/lambda
q1=quantile(X9,0.25) #Cuantil 1 de la variable X
q2=quantile(X9,0.5)
q3=quantile(X9,0.75)
y1=min(X9)
y2=max(X9)
ri=IQR(X9)
boxplot(X9, horizontal=TRUE, ylim=c(y1,y2))
abline(v=q3+1.5*ri, col="red")

```



```
N_pecesBC= X9  
qqnorm(N_pecesBC)  
qqline(N_pecesBC)
```

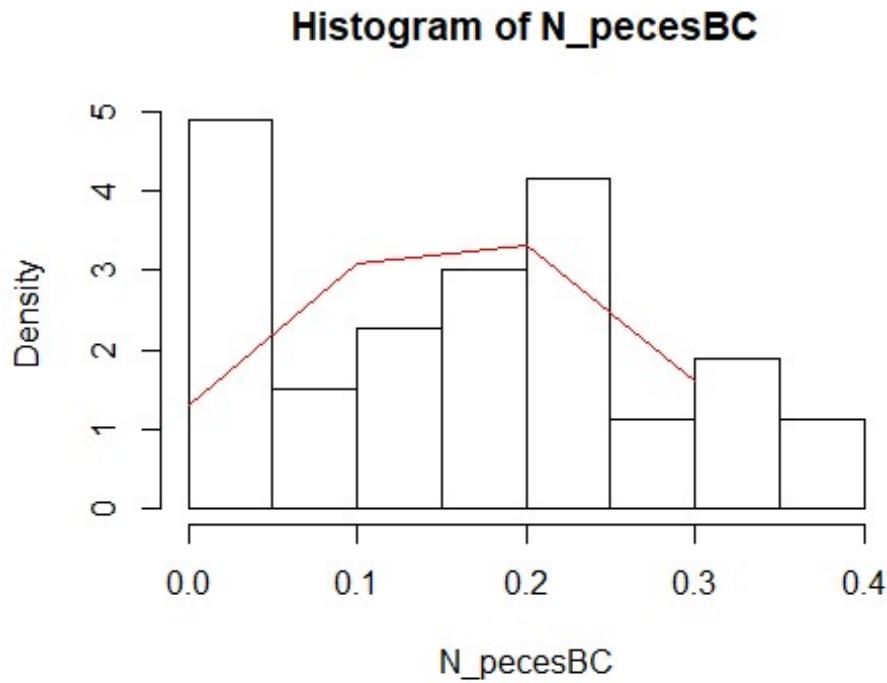
Normal Q-Q Plot



```

hist(N_pecesBC,prob=TRUE,col=0)
x=seq(min(N_pecesBC),max(N_pecesBC),0.1)
y=dnorm(x,mean(N_pecesBC),sd(N_pecesBC))
lines(x,y,col="red")

```



```

library(moments)
skewness1=skewness(N_pecesBC)
cat("Sesgo: ",skewness1)

## Sesgo:  0.1444805

cat("\n")

kurtosis1=kurtosis(N_pecesBC)
cat("Curtosis: ",kurtosis1)

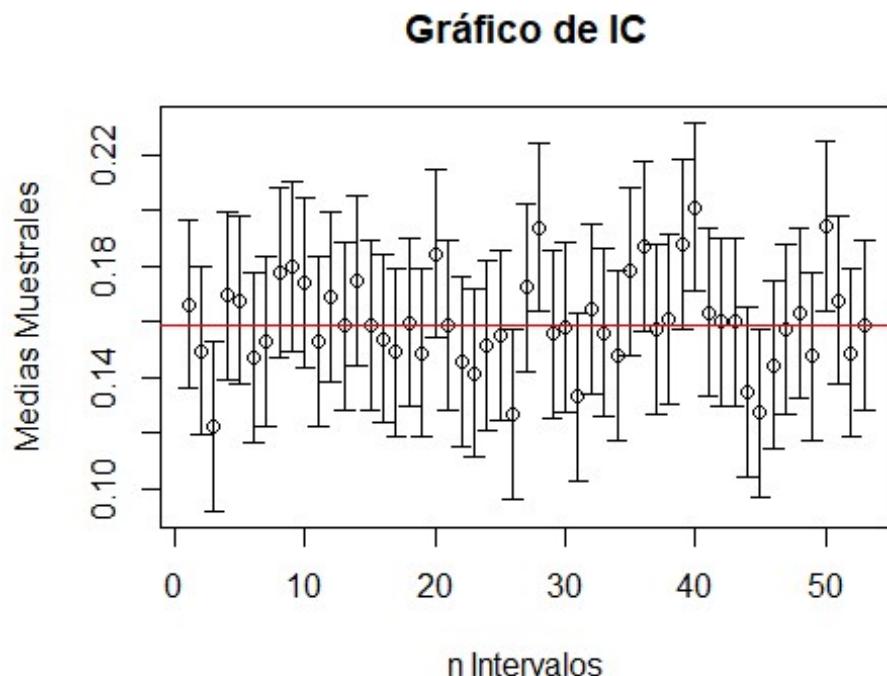
## Curtosis:  1.981965

cat("\n")

library(plotrix)
n=length(N_pecesBC)
media=mean(N_pecesBC)
DE=sd(N_pecesBC)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)

```

```
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias Muestrales")
abline(h=media,col="red")
```



```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de:  0.15896  +-  0.03029483
cor.test(M1$X7,M1$X9)

##
## Pearson's product-moment correlation
##
## data:  M1$X7 and M1$X9
## t = 17.679, df = 51, p-value < 2.2e-16
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  0.8766037 0.9575259
## sample estimates:
##      cor
## 0.9272051

regresion=lm(M1$X7 ~ M1$X9)
regresion

##
## Call:
## lm(formula = M1$X7 ~ M1$X9)
```

```

## 
## Coefficients:
## (Intercept)      M1$X9
##       0.1180      0.9528

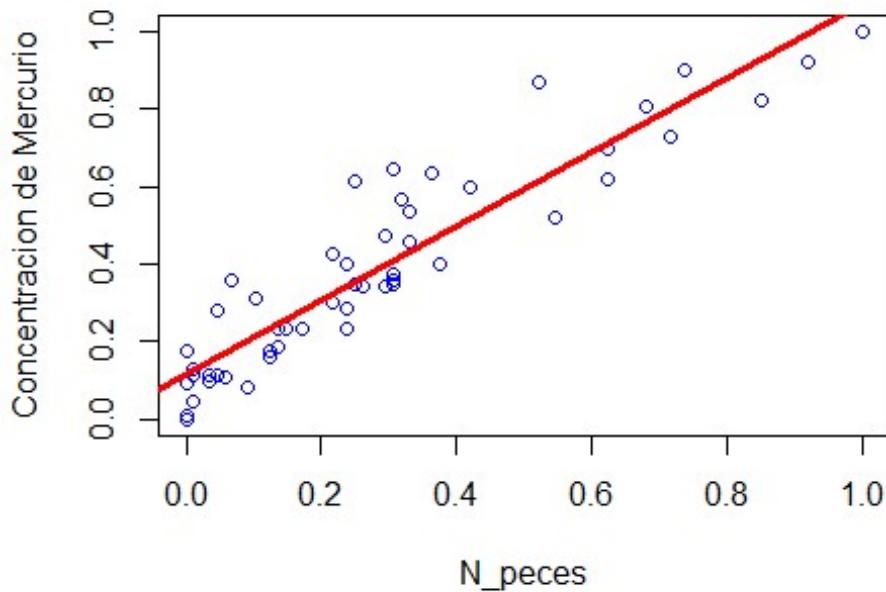
N_peces=summary(regresion)
N_peces

##
## Call:
## lm(formula = M1$X7 ~ M1$X9)
##
## Residuals:
##    Min     1Q Median     3Q    Max
## -0.11936 -0.07077 -0.02620  0.06028  0.25620
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept)  0.11801   0.02011   5.869 3.29e-07 ***
## M1$X9        0.95275   0.05389  17.679 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.09999 on 51 degrees of freedom
## Multiple R-squared:  0.8597, Adjusted R-squared:  0.857 
## F-statistic: 312.5 on 1 and 51 DF,  p-value: < 2.2e-16

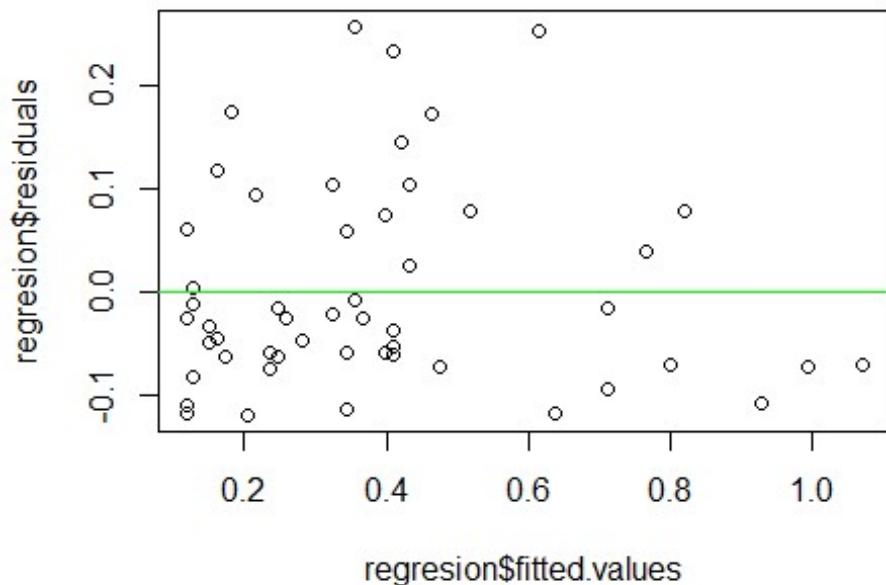
plot(M1$X9,M1$X7,col="blue",xlab="N_peces",ylab="Concentracion de Mercurio",main="N_peces vs. Concentracion de Mercurio")
abline(regresion,col="red",lwd=3)
text(80,1.2,"B1=-0.005302 B0=0.726140")

```

N_peces vs. Concentracion de Mercurio



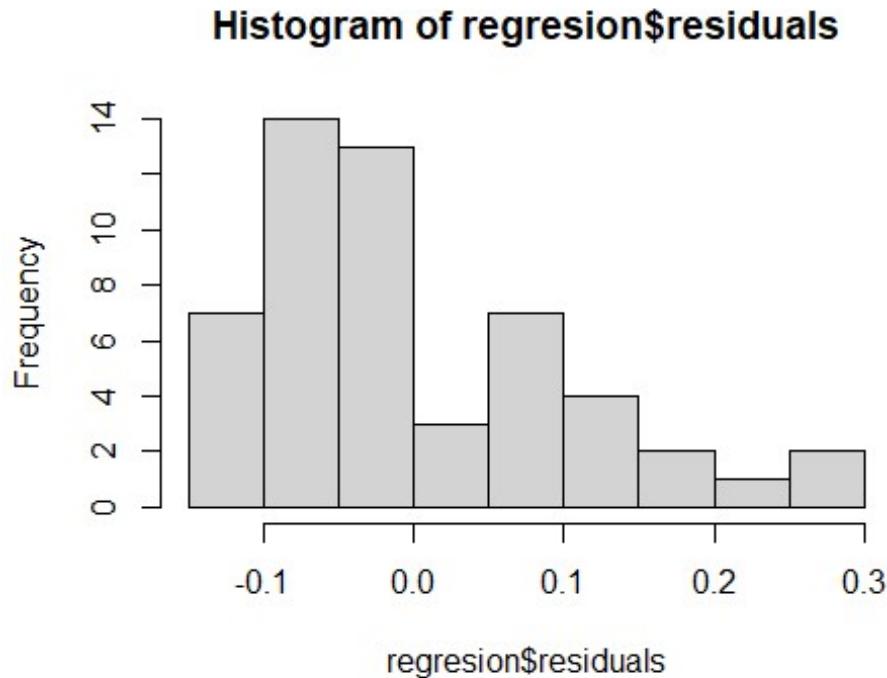
```
plot(regresion$fitted.values, regresion$residuals)
abline(h=0,col="green")
```



```
shapiro.test(regresion$residuals)

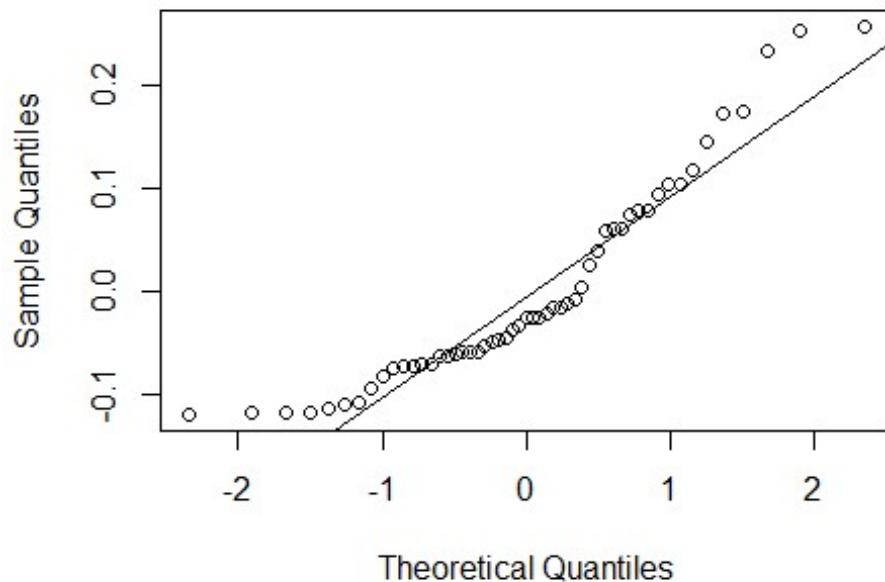
##
##  Shapiro-Wilk normality test
##
## data: regresion$residuals
## W = 0.89509, p-value = 0.0002206

hist(regresion$residuals)
```



```
qqnorm(regresion$residuals)
qqline(regresion$residuals)
```

Normal Q-Q Plot



```
t.test(regresion$residuals)

##
##  One Sample t-test
##
##  data: regresion$residuals
##  t = -2.5991e-16, df = 52, p-value = 1
##  alternative hypothesis: true mean is not equal to 0
##  95 percent confidence interval:
##  -0.0272934  0.0272934
##  sample estimates:
##      mean of x
##  -3.535228e-18

cor.test(M1$X7,N_pecesBC)

##
##  Pearson's product-moment correlation
##
##  data: M1$X7 and N_pecesBC
##  t = 16.933, df = 51, p-value < 2.2e-16
##  alternative hypothesis: true correlation is not equal to 0
##  95 percent confidence interval:
##  0.8670586 0.9540872
##  sample estimates:
##      cor
##  0.9214102
```

```

regresion=lm(M1$X7 ~ N_pecesBC)
regresion

##
## Call:
## lm(formula = M1$X7 ~ N_pecesBC)
##
## Coefficients:
## (Intercept)    N_pecesBC
##      0.03354     2.16473

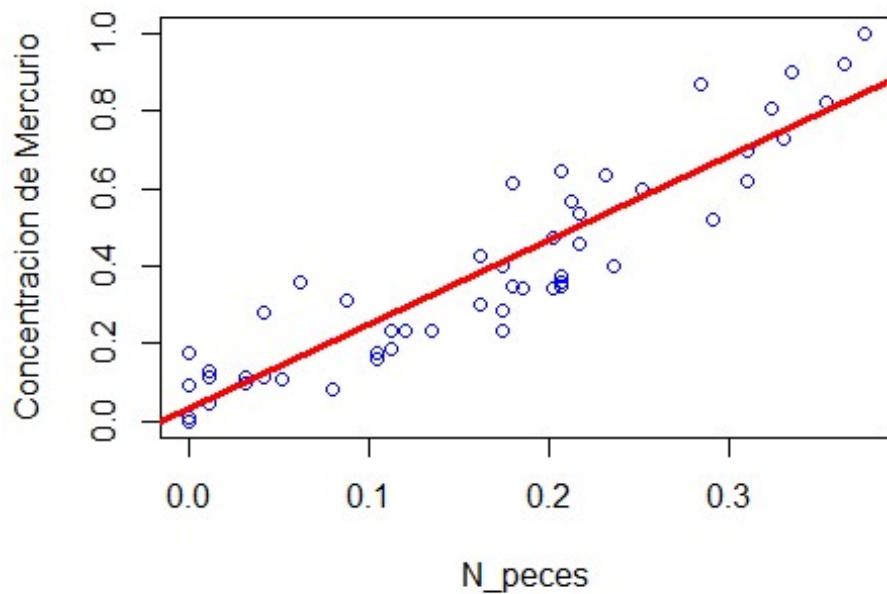
N_peces=summary(regresion)
N_peces

##
## Call:
## lm(formula = M1$X7 ~ N_pecesBC)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.177870 -0.085867 -0.009339  0.072952  0.219104
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)
## (Intercept)  0.03354   0.02482   1.352   0.182
## N_pecesBC   2.16473   0.12784  16.933  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.1037 on 51 degrees of freedom
## Multiple R-squared:  0.849, Adjusted R-squared:  0.846
## F-statistic: 286.7 on 1 and 51 DF,  p-value: < 2.2e-16

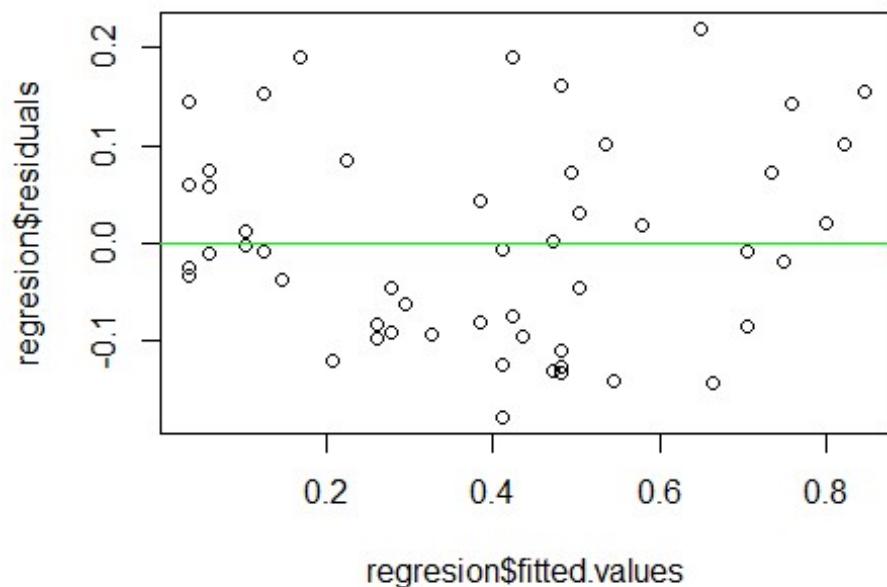
plot(N_pecesBC,M1$X7,col="blue",xlab="N_peces",ylab="Concentracion de
Mercurio",main="N_peces Box-Cox vs. Concentracion de Mercurio")
abline(regresion,col="red",lwd=3)
text(80,1.2,"B1=-0.005302 B0=0.726140")

```

N_peces Box-Cox vs. Concentracion de Mercurio



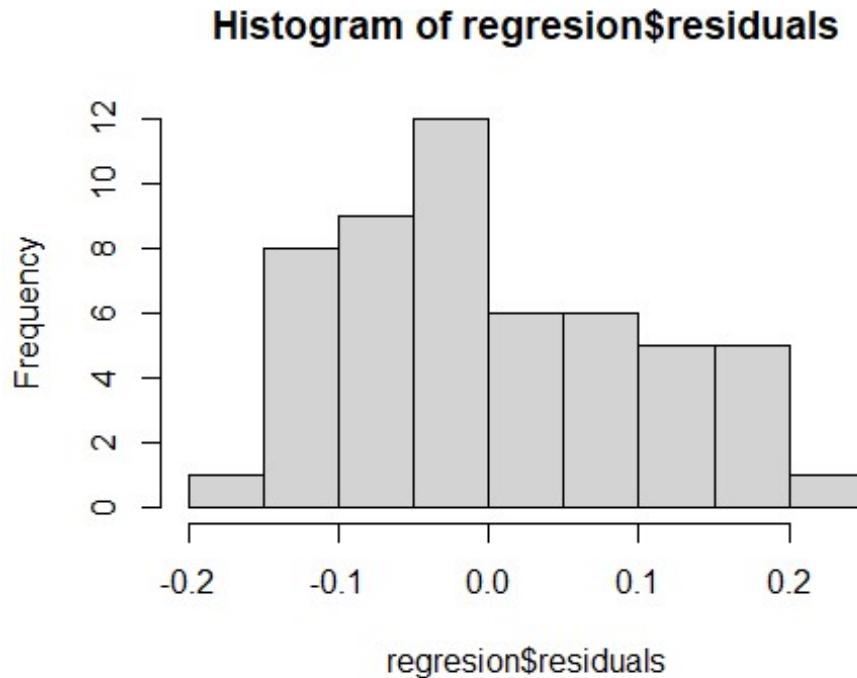
```
plot(regresion$fitted.values, regresion$residuals)
abline(h=0,col="green")
```



```
shapiro.test(regresion$residuals)

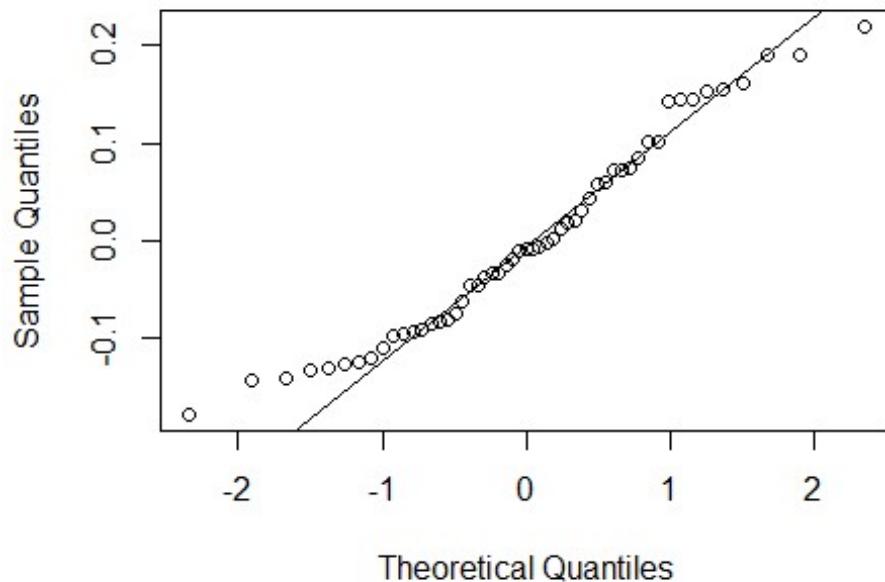
##
##  Shapiro-Wilk normality test
##
## data: regresion$residuals
## W = 0.95979, p-value = 0.07185

hist(regresion$residuals)
```



```
qqnorm(regresion$residuals)
qqline(regresion$residuals)
```

Normal Q-Q Plot



```
t.test(regresion$residuals)

##
##  One Sample t-test
##
## data: regresion$residuals
## t = 2.5081e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.02831628  0.02831628
## sample estimates:
##   mean of x
## 3.539255e-18

z1=N_pecesBC
z2=N_pecesBC^2
cor.test(M1$X7 , z1+ z2)

##
## Pearson's product-moment correlation
##
## data: M1$X7 and z1 + z2
## t = 18.29, df = 51, p-value < 2.2e-16
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  0.8837265 0.9600769
## sample estimates:
```

```

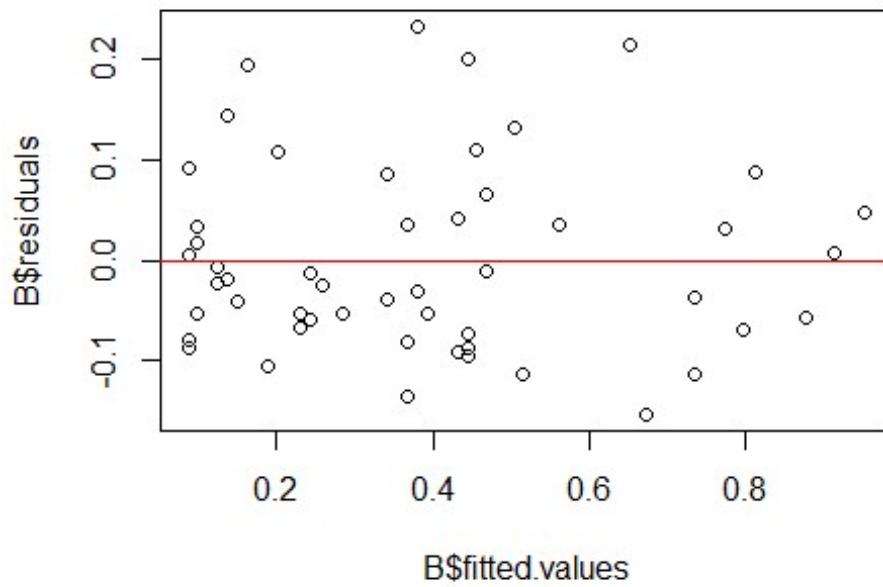
##      cor
## 0.9315136

B = lm(M1$X7 ~ z1+ z2)
summary(B)

##
## Call:
## lm(formula = M1$X7 ~ z1 + z2)
##
## Residuals:
##      Min      1Q  Median      3Q     Max 
## -0.15308 -0.06869 -0.02248  0.04788  0.23197 
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept)  0.08701   0.02818   3.088  0.00328 **  
## z1          1.00538   0.37772   2.662  0.01043 *   
## z2          3.47088   1.07478   3.229  0.00219 **  
## ---        
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1 
##
## Residual standard error: 0.0953 on 50 degrees of freedom
## Multiple R-squared:  0.8751, Adjusted R-squared:  0.8701 
## F-statistic: 175.1 on 2 and 50 DF,  p-value: < 2.2e-16

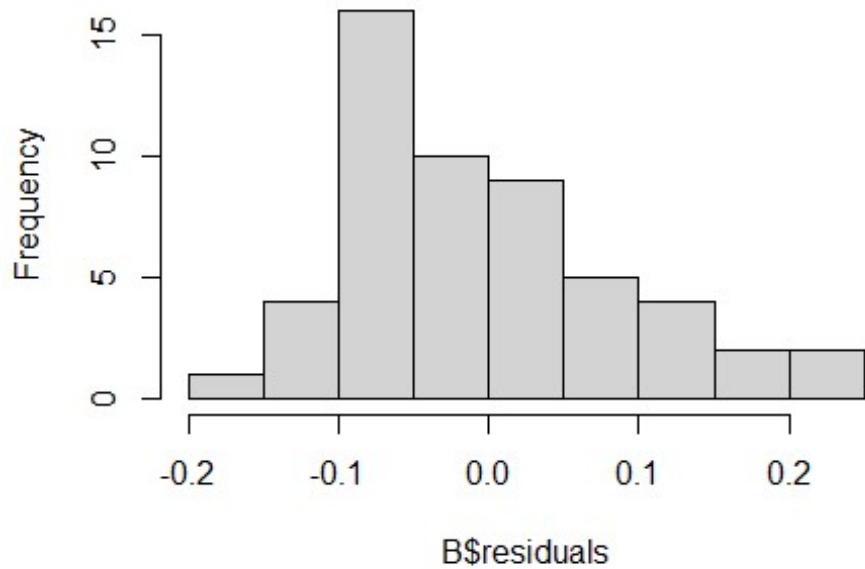
plot(B$fitted.values, B$residuals)
abline(h=0,col="red")

```



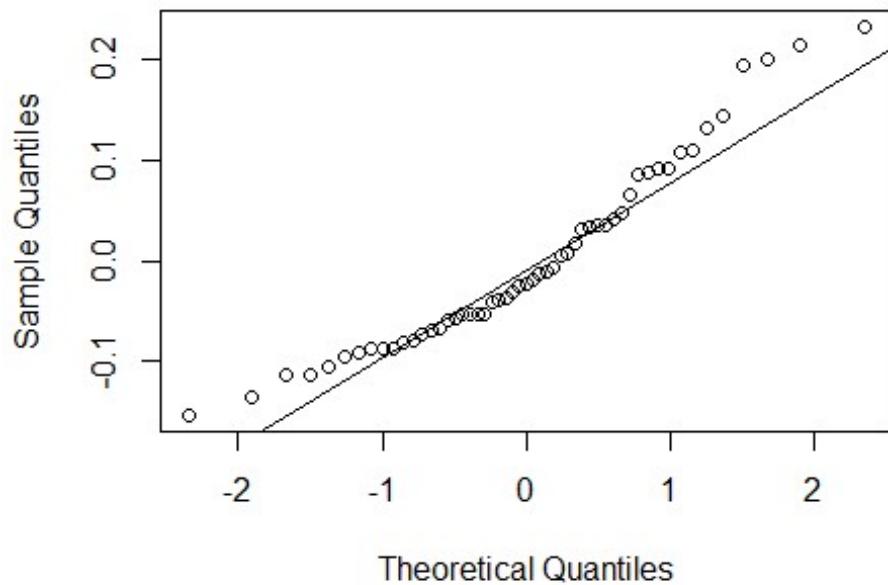
```
shapiro.test(B$residuals)
##
##  Shapiro-Wilk normality test
##
## data: B$residuals
## W = 0.94025, p-value = 0.01046
hist(B$residuals)
```

Histogram of B\$residuals



```
qqnorm(B$residuals)  
qqline(B$residuals)
```

Normal Q-Q Plot



```

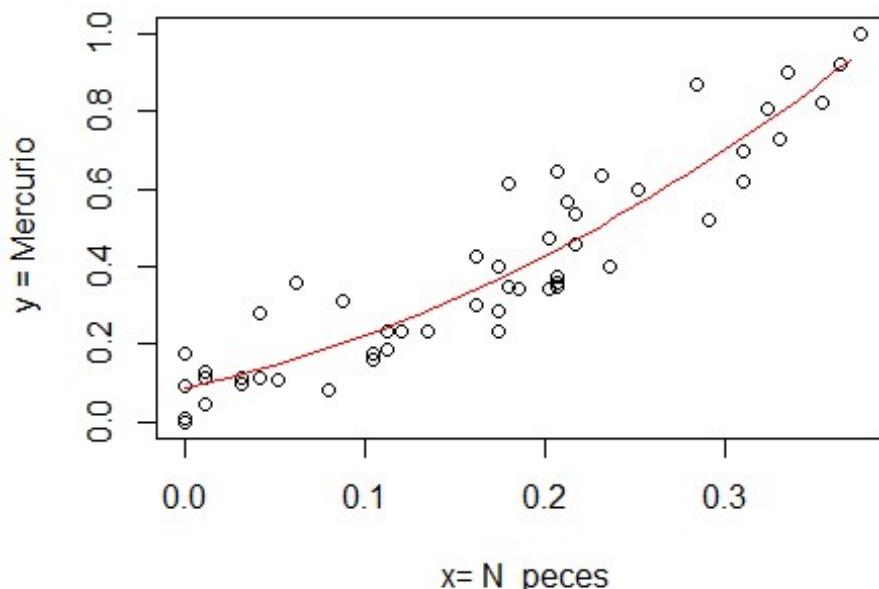
t.test(B$residuals)

##
##  One Sample t-test
##
## data: B$residuals
## t = 8.1642e-17, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.02575719 0.02575719
## sample estimates:
##   mean of x
## 1.047956e-18

x=N_pecesBC
y=M1$X7
plot(x, y, main = "Modelo Cuadratico", xlab =" x= N_peces", ylab =" y = Mercurio")
x1 = seq(min(x), max(x), 0.01)
y1 = 0.08701 +1.00538*x1 +3.47088*x1^2
lines(x1, y1, col = "red")
text(1, .1, "0.08701 +1.00538*x1 +3.47088*x1^2")

```

Modelo Cuadratico



```

z1=N_pecesBC+1
z2=log(N_pecesBC+1)
cor.test(M1$X7 , log(N_pecesBC+1))

```

```

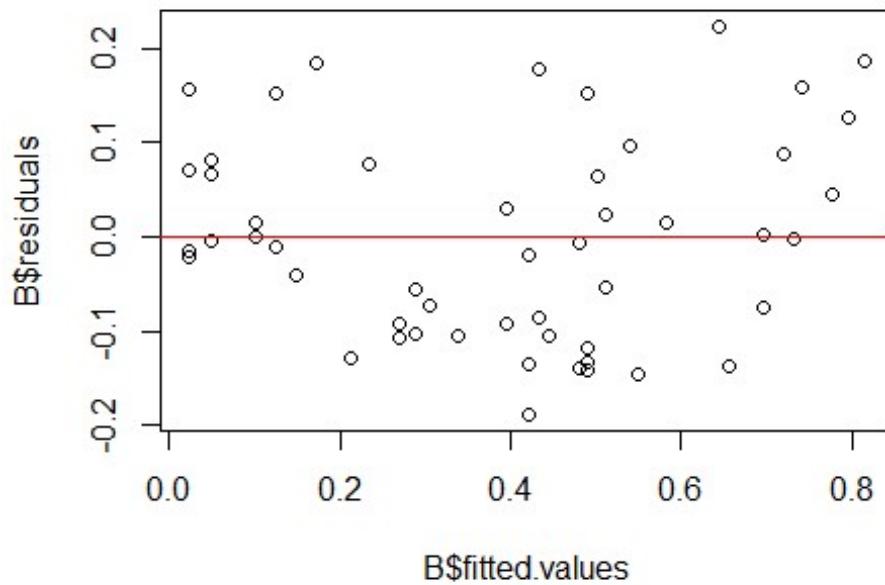
## 
## Pearson's product-moment correlation
## 
## data: M1$X7 and log(N_pecesBC + 1)
## t = 15.98, df = 51, p-value < 2.2e-16
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  0.8532455 0.9490700
## sample estimates:
##      cor
## 0.9129812

B = lm(M1$X7 ~ log(N_pecesBC+1))
summary(B)

##
## Call:
## lm(formula = M1$X7 ~ log(N_pecesBC + 1))
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.188848 -0.092910 -0.007039  0.076887  0.223703
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept) 0.02245   0.02679   0.838   0.406    
## log(N_pecesBC + 1) 2.48563   0.15554  15.980  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.1089 on 51 degrees of freedom
## Multiple R-squared:  0.8335, Adjusted R-squared:  0.8303 
## F-statistic: 255.4 on 1 and 51 DF,  p-value: < 2.2e-16

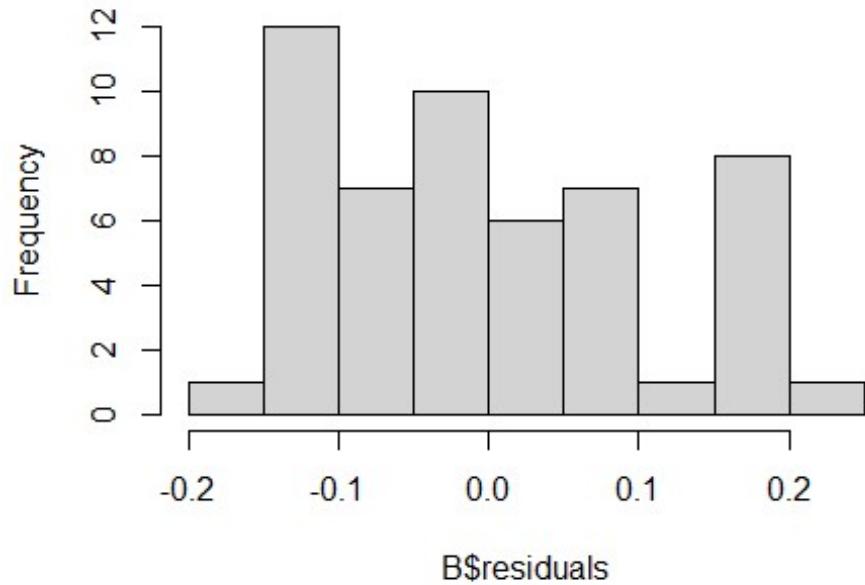
plot(B$fitted.values, B$residuals)
abline(h=0,col="red")

```



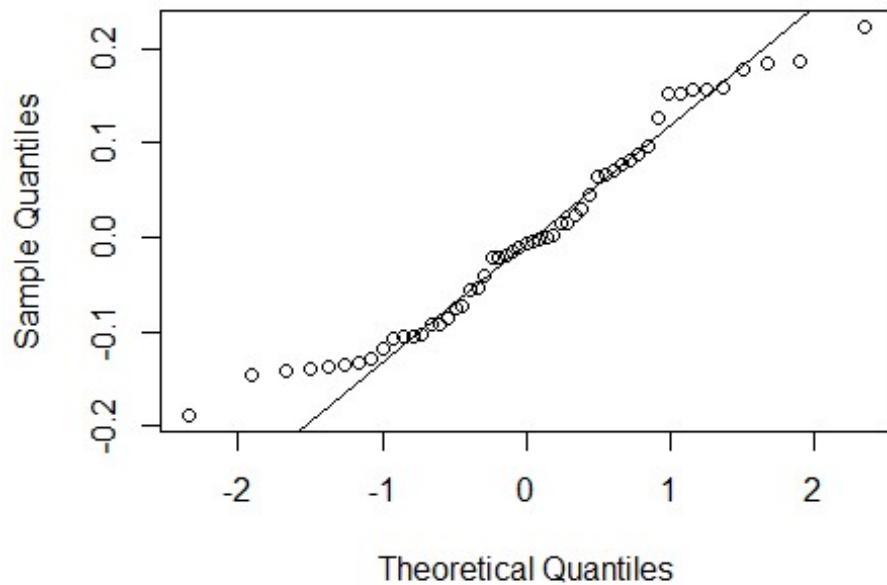
```
shapiro.test(B$residuals)
##
##  Shapiro-Wilk normality test
##
## data: B$residuals
## W = 0.95466, p-value = 0.04281
hist(B$residuals)
```

Histogram of B\$residuals



```
qqnorm(B$residuals)  
qqline(B$residuals)
```

Normal Q-Q Plot



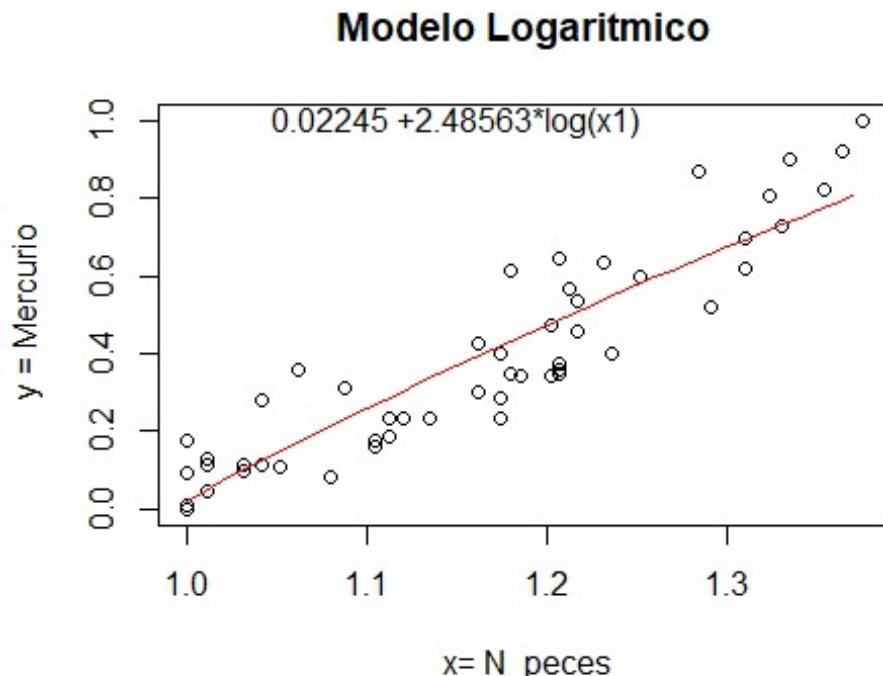
```

t.test(B$residuals)

##
##  One Sample t-test
##
## data: B$residuals
## t = 1.0775e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.02973068 0.02973068
## sample estimates:
##   mean of x
## 1.596385e-18

x=N_pecesBC+1
y=M1$X7
plot(x, y, main = "Modelo Logaritmico", xlab =" x= N_peces", ylab =" y =
Mercurio")
x1 = seq(min(x), max(x), 0.01)
y1 = 0.02245 +2.48563*log(x1)
lines(x1, y1, col = "red")
text(1.15, 1, "0.02245 +2.48563*log(x1)")

```



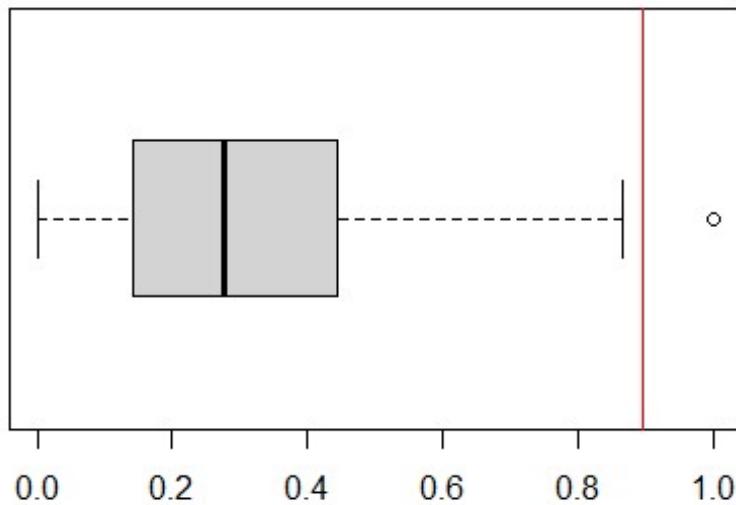
Estimacion

```

q1=quantile(M1$X11,0.25) #Cuartil 1 de la variable X
q2=quantile(M1$X11,0.5)

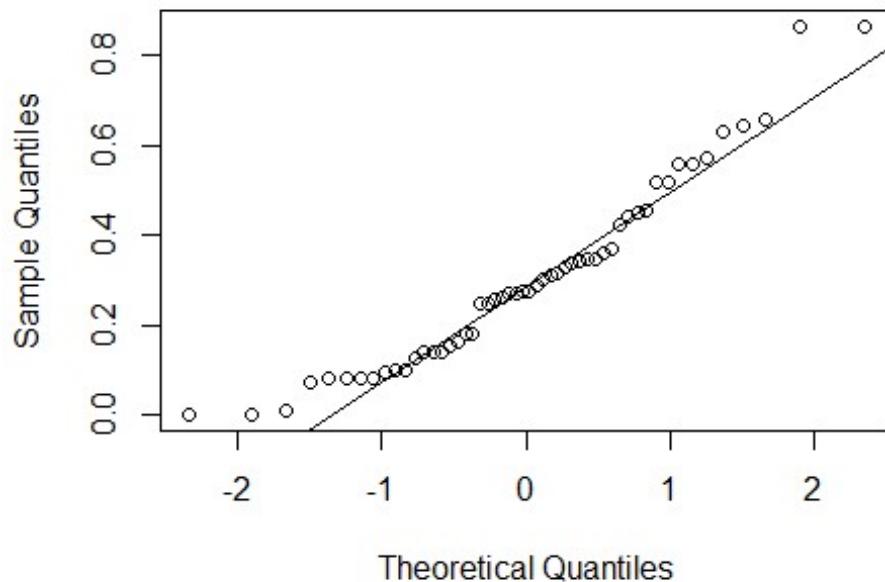
```

```
q3=quantile(M1$X11,0.75)
y1=min(M1$X11)
y2=max(M1$X11)
ri=IQR(M1$X11)
boxplot(M1$X11, horizontal=TRUE, ylim=c(y1,y2))
abline(v=q3+1.5*ri, col="red")
```



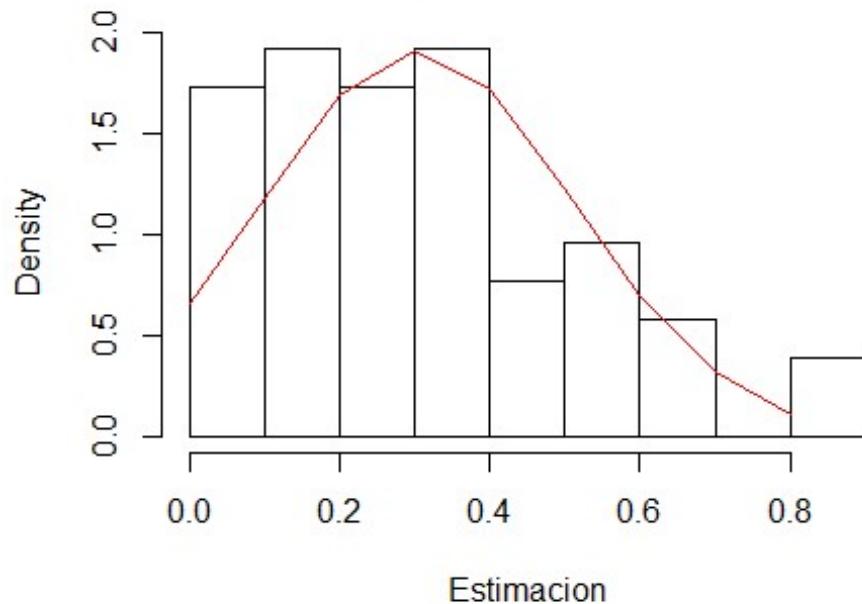
```
Estimacion= M1[M1$X11< q3+1.5*ri, c("X11")]
qqnorm(Estimacion)
qqline(Estimacion)
```

Normal Q-Q Plot



```
hist(Estimacion,prob=TRUE,col=0)
x=seq(min(Estimacion),max(Estimacion),0.1)
y=dnorm(x,mean(Estimacion),sd(Estimacion))
lines(x,y,col="red")
```

Histogram of Estimacion



```
library(moments)
skewness1=skewness(Estimacion)
cat("Sesgo: ",skewness1)

## Sesgo:  0.7840477

cat("\n")

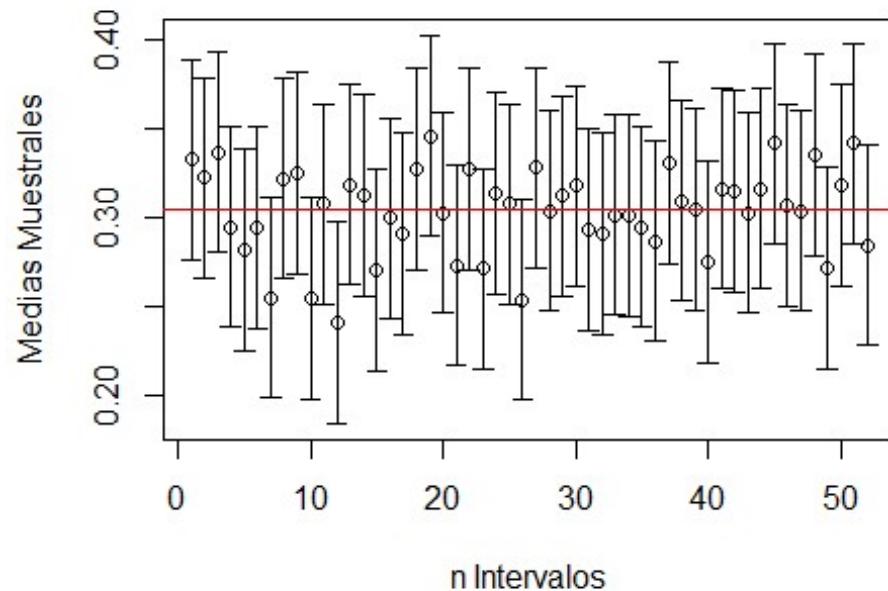
kurtosis1=kurtosis(Estimacion)
cat("Curtosis: ",kurtosis1)

## Curtosis:  3.244217

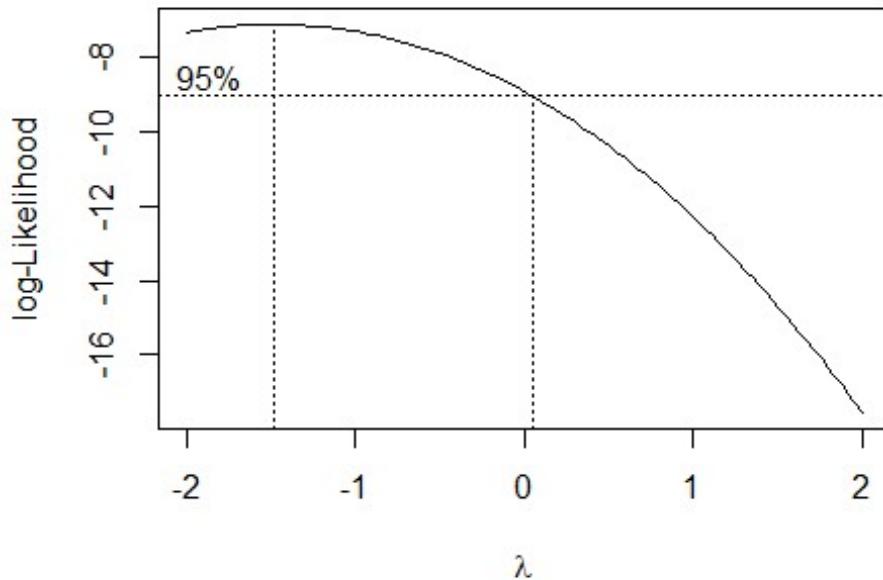
cat("\n")

library(plotrix)
n=length(Estimacion)
media=mean(Estimacion)
DE=sd(Estimacion)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias
Muestrales")
abline(h=media,col="red")
```

Gráfico de IC



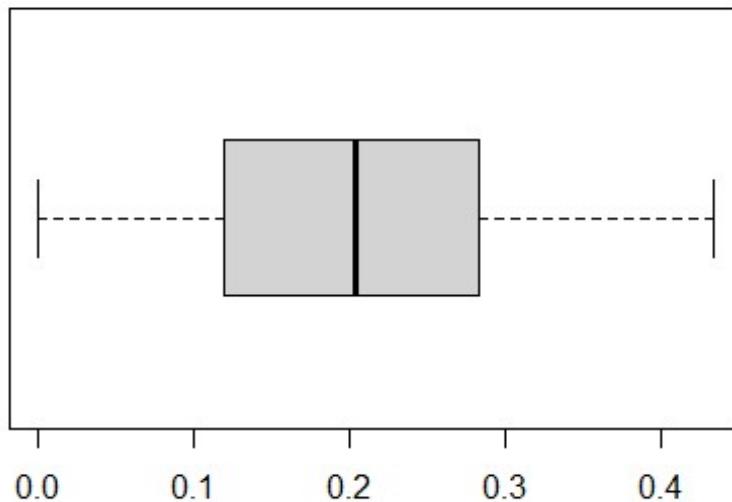
```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de: 0.3044657 +- 0.05661494
library(MASS)
minim=min(M1$X11)
b <- boxcox(lm((M1$X11+1) ~ 1))
```



```

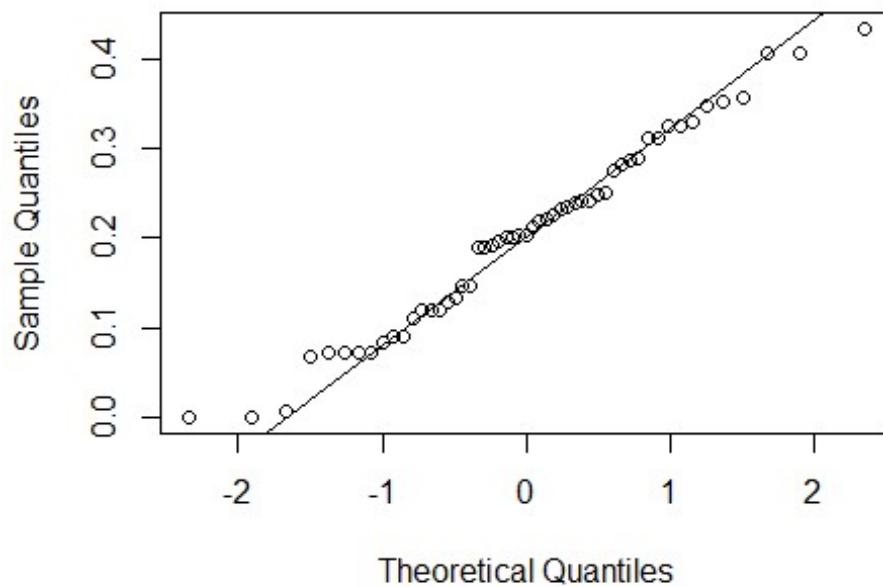
lambda <- b$x[which.max(b$y)]
X11<-((M1$X11+1)^lambda-1)/lambda
q1=quantile(X11,0.25) #Cuantil 1 de la variable X
q2=quantile(X11,0.5)
q3=quantile(X11,0.75)
y1=min(X11)
y2=max(X11)
ri=IQR(X11)
boxplot(X11,horizontal=TRUE,ylim=c(y1,y2))
abline(v=q3+1.5*ri,col="red")

```



```
EstimacionBC= X11  
qqnorm(EstimacionBC)  
qqline(EstimacionBC)
```

Normal Q-Q Plot

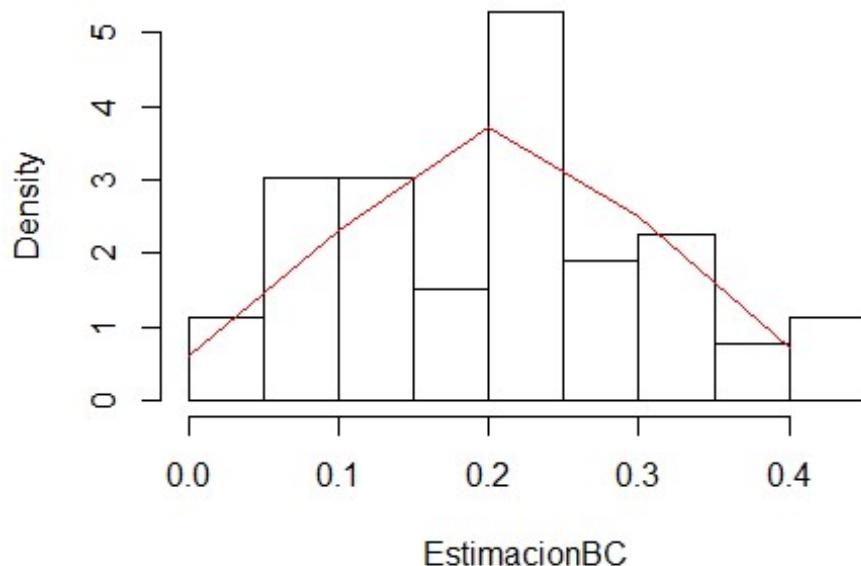


```

hist(EstimacionBC,prob=TRUE,col=0)
x=seq(min(EstimacionBC),max(EstimacionBC),0.1)
y=dnorm(x,mean(EstimacionBC),sd(EstimacionBC))
lines(x,y,col="red")

```

Histogram of EstimacionBC



```

library(moments)
skewness1=skewness(EstimacionBC)
cat("Sesgo: ",skewness1)

## Sesgo:  0.05524268
cat("\n")

kurtosis1=kurtosis(EstimacionBC)
cat("Curtosis: ",kurtosis1)

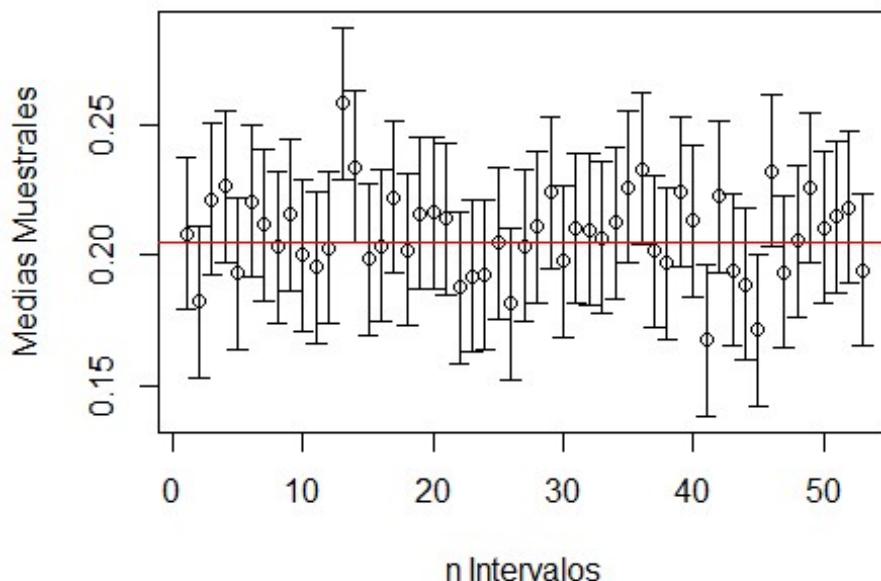
## Curtosis:  2.3504
cat("\n")

library(plotrix)
n=length(EstimacionBC)
media=mean(EstimacionBC)
DE=sd(EstimacionBC)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)

```

```
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias Muestrales")
abline(h=media,col="red")
```

Gráfico de IC



```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de: 0.2046482 +- 0.02901399
cor.test(M1$X7,M1$X11)

##
## Pearson's product-moment correlation
##
## data: M1$X7 and M1$X11
## t = 24.233, df = 51, p-value < 2.2e-16
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## 0.9300566 0.9763663
## sample estimates:
##      cor
## 0.9592148

regresion=lm(M1$X7 ~ M1$X11)
regresion

##
## Call:
## lm(formula = M1$X7 ~ M1$X11)
```

```

##  

## Coefficients:  

## (Intercept)      M1$X11  

##       0.02339     1.11547  

Estimacion=summary(regresion)  

Estimacion  

##  

## Call:  

## lm(formula = M1$X7 ~ M1$X11)  

##  

## Residuals:  

##      Min       1Q   Median       3Q      Max  

## -0.21638 -0.03204 -0.01245  0.01086  0.21119  

##  

## Coefficients:  

##             Estimate Std. Error t value Pr(>|t|)  

## (Intercept)  0.02339   0.01792   1.305   0.198  

## M1$X11      1.11547   0.04603  24.233  <2e-16 ***  

## ---  

## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1  

##  

## Residual standard error: 0.07546 on 51 degrees of freedom  

## Multiple R-squared:  0.9201, Adjusted R-squared:  0.9185  

## F-statistic: 587.2 on 1 and 51 DF,  p-value: < 2.2e-16  

plot(M1$X11,M1$X7,col="blue",xlab="Estimacion",ylab="Concentracion de  

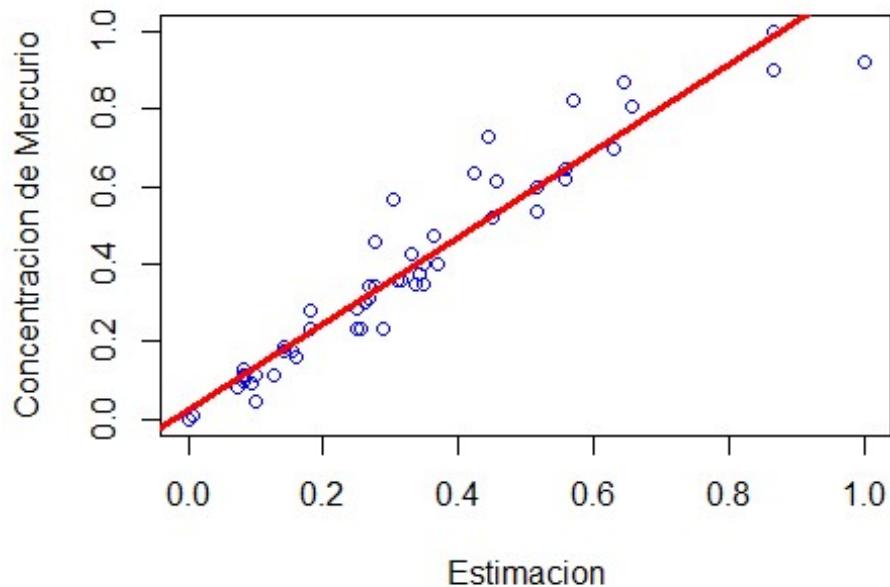
Mercurio",main="Estimacion vs. Concentracion de Mercurio")  

abline(regresion,col="red",lwd=3)  

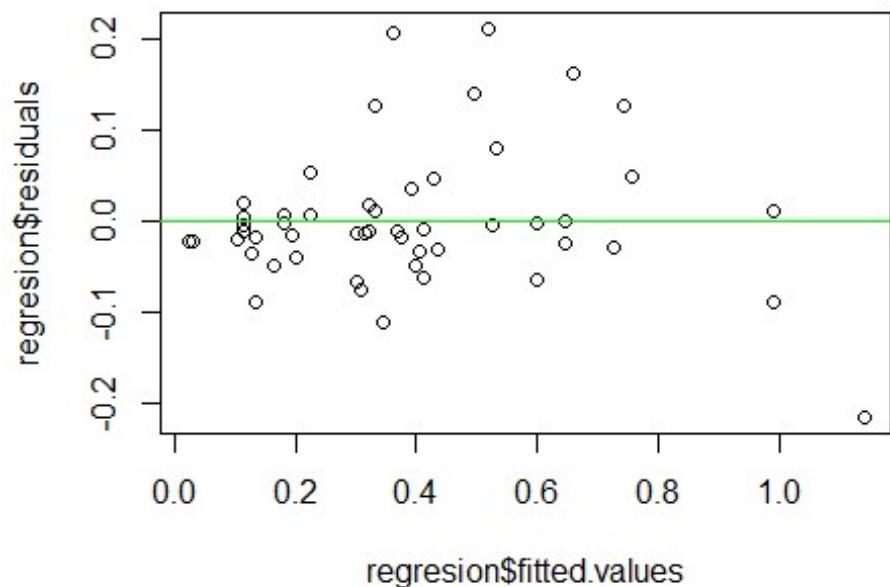
text(80,1.2,"B1=-0.005302 B0=0.726140")

```

Estimacion vs. Concentracion de Mercurio



```
plot(regresion$fitted.values, regresion$residuals)
abline(h=0,col="green")
```

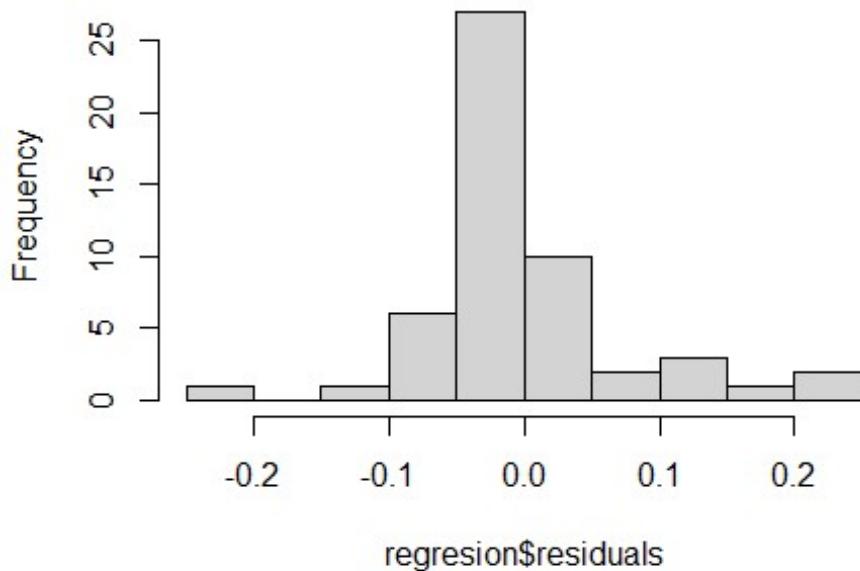


```
shapiro.test(regresion$residuals)

##
##  Shapiro-Wilk normality test
##
## data: regresion$residuals
## W = 0.89095, p-value = 0.0001611

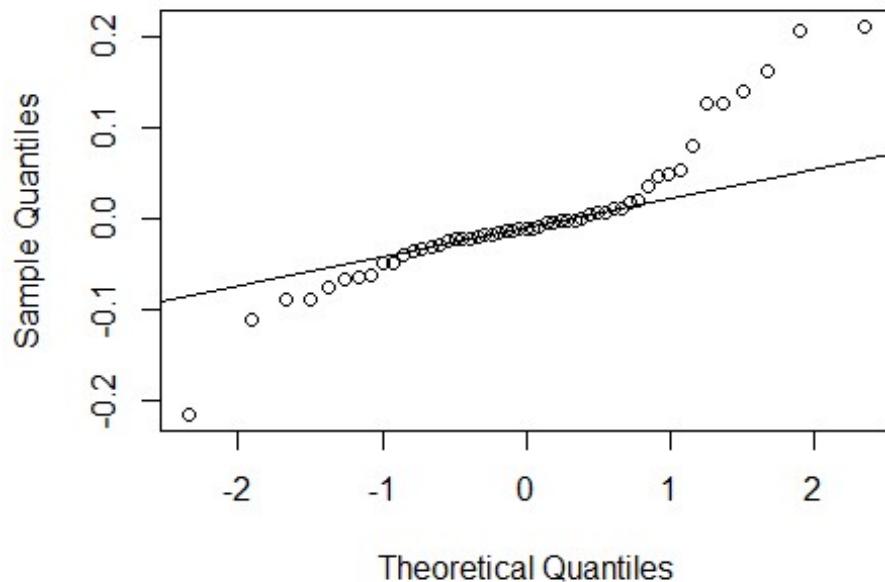
hist(regresion$residuals)
```

Histogram of regresion\$residuals



```
qqnorm(regresion$residuals)
qqline(regresion$residuals)
```

Normal Q-Q Plot



```
t.test(regresion$residuals)

##
##  One Sample t-test
##
## data: regresion$residuals
## t = -6.1197e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.02059849  0.02059849
## sample estimates:
##   mean of x
## -6.281992e-18

cor.test(M1$X7,EstimacionBC)

##
## Pearson's product-moment correlation
##
## data: M1$X7 and EstimacionBC
## t = 23.044, df = 51, p-value < 2.2e-16
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## 0.9232584 0.9740086
## sample estimates:
##   cor
## 0.9551849
```

```

regresion=lm(M1$X7 ~ EstimacionBC)
regresion

##
## Call:
## lm(formula = M1$X7 ~ EstimacionBC)
##
## Coefficients:
## (Intercept)  EstimacionBC
##           -0.1019       2.3432

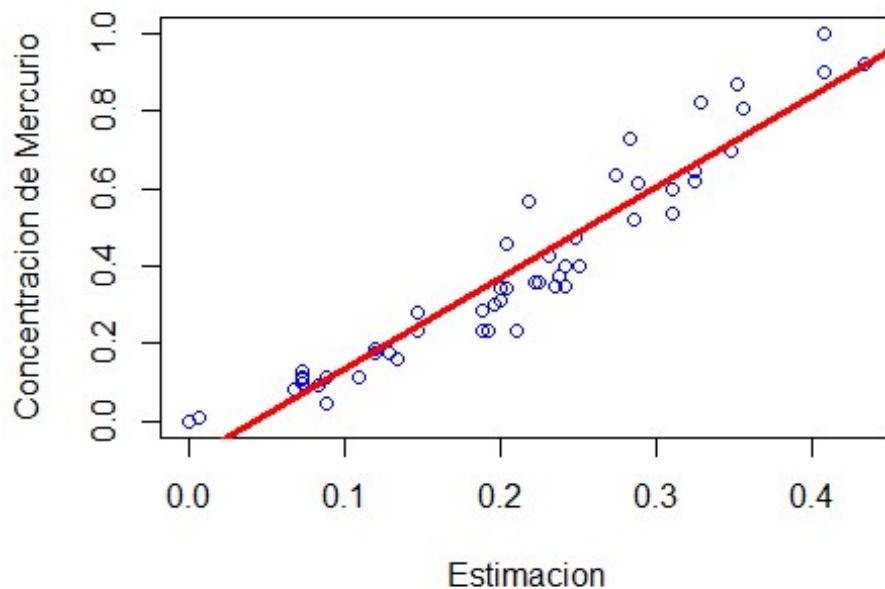
Estimacion=summary(regresion)
Estimacion

##
## Call:
## lm(formula = M1$X7 ~ EstimacionBC)
##
## Residuals:
##      Min      1Q  Median      3Q     Max 
## -0.16124 -0.05700 -0.01157  0.04558  0.16688 
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept) -0.10187    0.02347  -4.341 6.74e-05 ***
## EstimacionBC 2.34315    0.10168   23.044 < 2e-16 ***
## ---    
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.07902 on 51 degrees of freedom
## Multiple R-squared:  0.9124, Adjusted R-squared:  0.9107 
## F-statistic:  531 on 1 and 51 DF,  p-value: < 2.2e-16

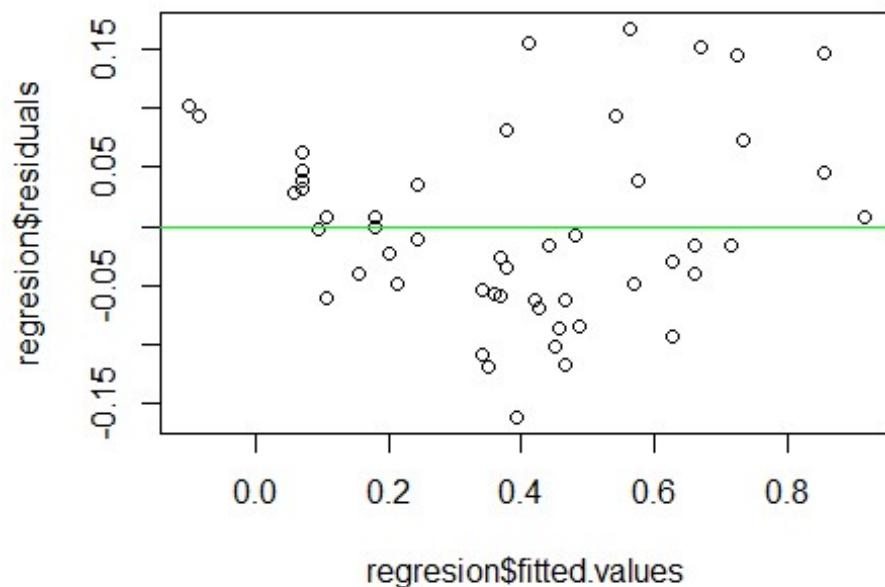
plot(EstimacionBC,M1$X7,col="blue",xlab="Estimacion",ylab="Concentracion de
Mercurio",main="Estimacion Box-Cox vs. Concentracion de Mercurio")
abline(regresion,col="red",lwd=3)
text(80,1.2,"B1=-0.005302 B0=0.726140")

```

Estimacion Box-Cox vs. Concentracion de Mercurio



```
plot(regresion$fitted.values, regresion$residuals)
abline(h=0,col="green")
```

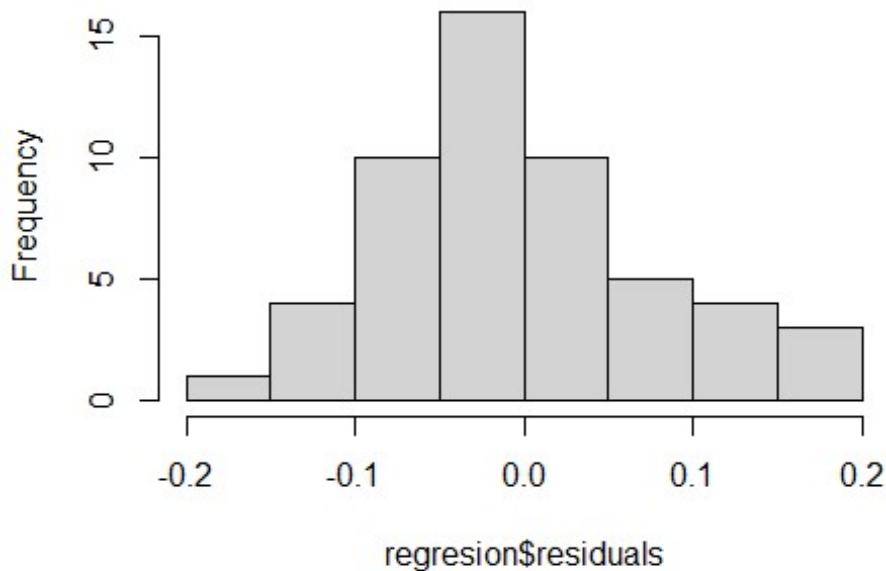


```
shapiro.test(regresion$residuals)

##
##  Shapiro-Wilk normality test
##
## data: regresion$residuals
## W = 0.97095, p-value = 0.2217

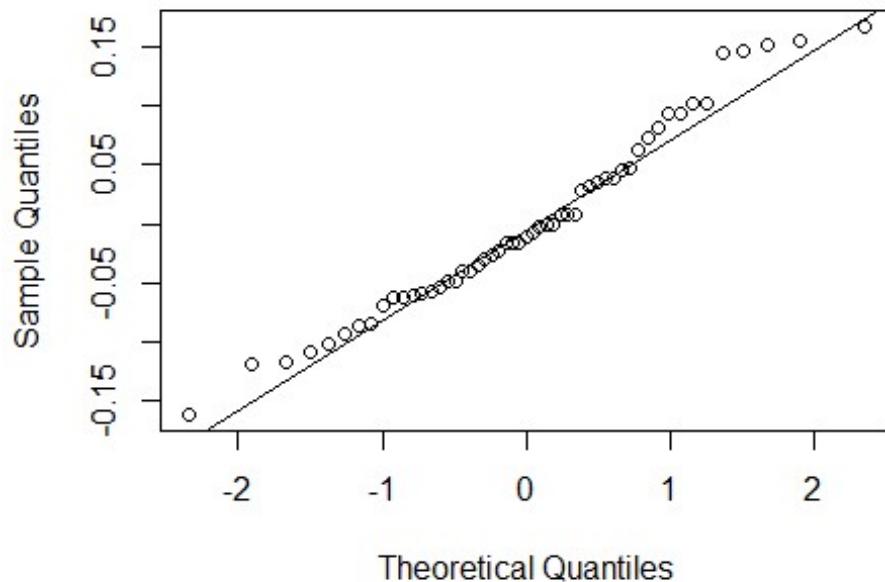
hist(regresion$residuals)
```

Histogram of regresion\$residuals



```
qqnorm(regresion$residuals)
qqline(regresion$residuals)
```

Normal Q-Q Plot



```
t.test(regresion$residuals)

##
##  One Sample t-test
##
## data: regresion$residuals
## t = -3.2619e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.02156996  0.02156996
## sample estimates:
##   mean of x
## -3.506264e-18

z1=EstimacionBC
z2=EstimacionBC^2
cor.test(M1$X7 , z1+ z2)

##
## Pearson's product-moment correlation
##
## data: M1$X7 and z1 + z2
## t = 26.242, df = 51, p-value < 2.2e-16
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  0.9396946 0.9796901
## sample estimates:
```

```

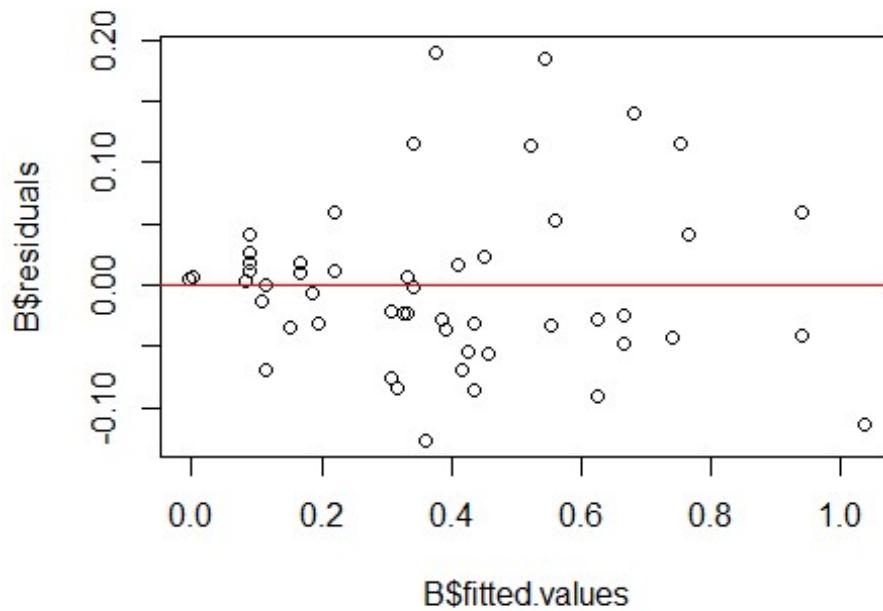
##      cor
## 0.9649079

B = lm(M1$X7 ~ z1+ z2)
summary(B)

##
## Call:
## lm(formula = M1$X7 ~ z1 + z2)
##
## Residuals:
##       Min     1Q Median     3Q    Max
## -0.126699 -0.036336 -0.001146  0.018686  0.189734
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept) -0.005741  0.030272 -0.190  0.85036    
## z1          1.083784  0.307253  3.527  0.00091 ***  
## z2          3.033206  0.709119  4.277 8.51e-05 ***  
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.06828 on 50 degrees of freedom
## Multiple R-squared:  0.9359, Adjusted R-squared:  0.9333 
## F-statistic: 364.7 on 2 and 50 DF,  p-value: < 2.2e-16

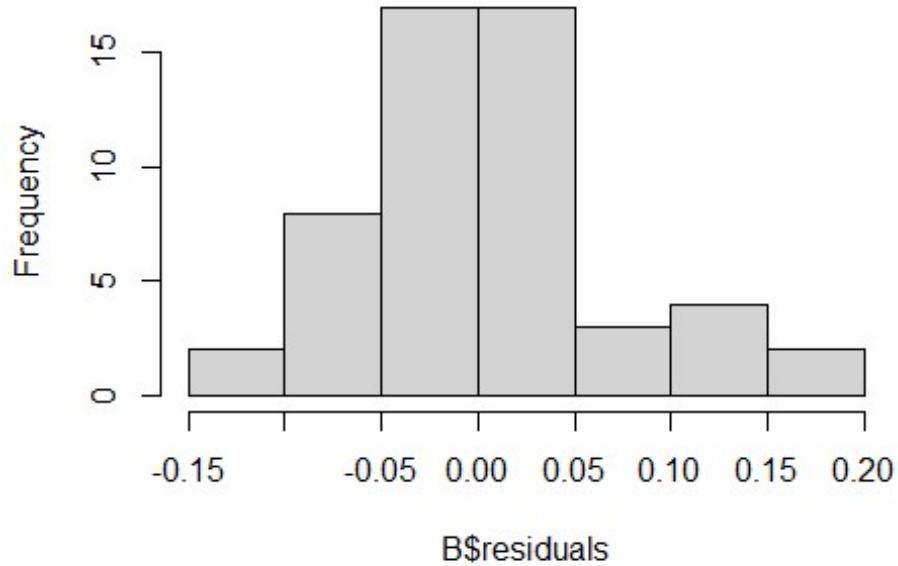
plot(B$fitted.values, B$residuals)
abline(h=0,col="red")

```



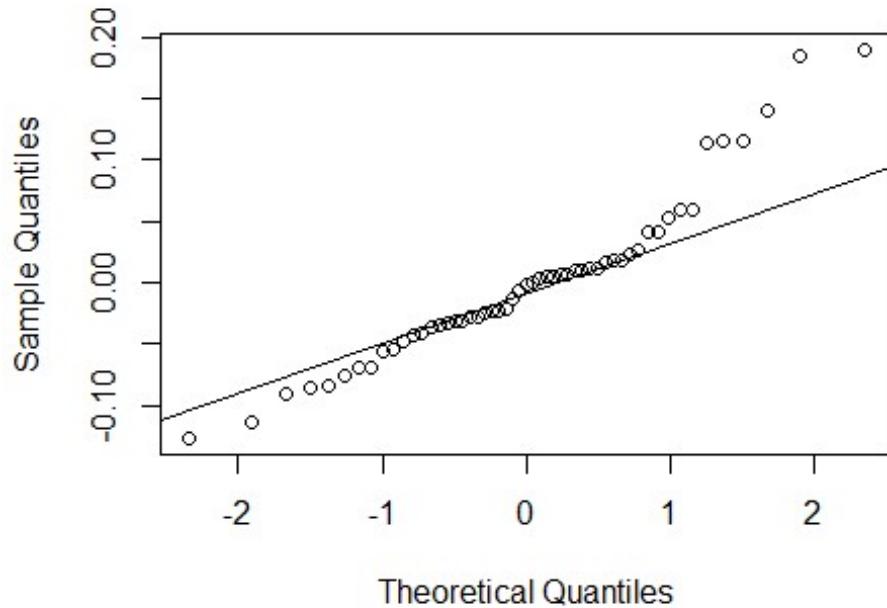
```
shapiro.test(B$residuals)
##
##  Shapiro-Wilk normality test
##
## data: B$residuals
## W = 0.93517, p-value = 0.006496
hist(B$residuals)
```

Histogram of B\$residuals



```
qqnorm(B$residuals)  
qqline(B$residuals)
```

Normal Q-Q Plot



```

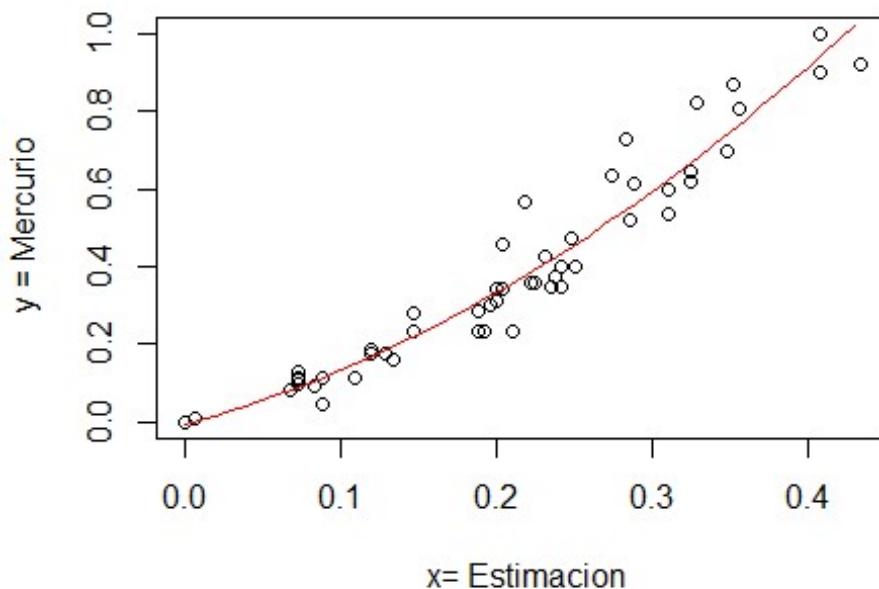
t.test(B$residuals)

##
##  One Sample t-test
##
## data: B$residuals
## t = -1.7447e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.01845591 0.01845591
## sample estimates:
##   mean of x
## -1.60468e-18

x=EstimacionBC
y=M1$X7
plot(x, y, main = "Modelo Cuadratico", xlab =" x= Estimacion", ylab =" y = Mercurio")
x1 = seq(min(x), max(x), 0.01)
y1 = -0.005741 +1.083784*x1 +3.033206*x1^2
lines(x1, y1, col = "red")
text(1, .1, "y =-0.005741 +1.083784*x1 +3.033206*x1^2")

```

Modelo Cuadratico



```

z1=EstimacionBC+1
z2=log(EstimacionBC+1)
cor.test(M1$X7 , log(EstimacionBC+1))

```

```

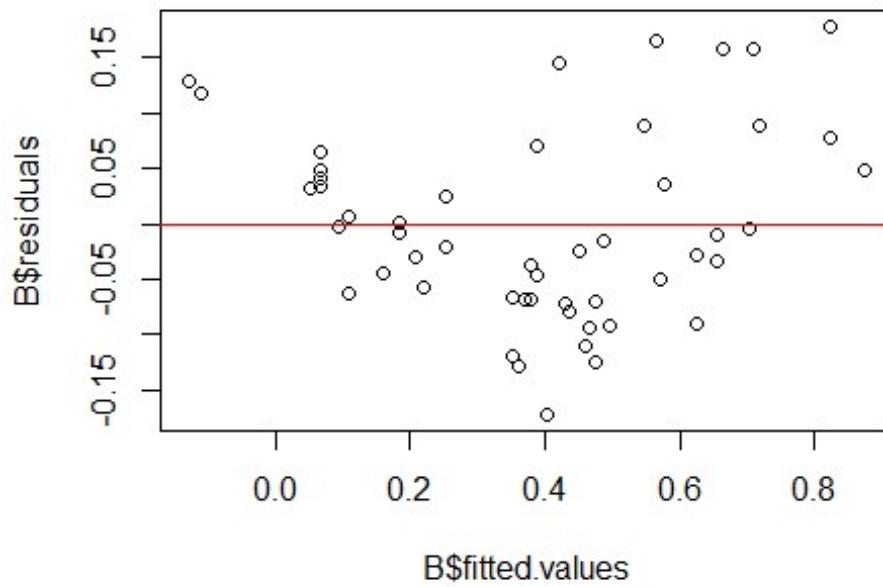
## 
## Pearson's product-moment correlation
## 
## data: M1$X7 and log(EstimacionBC + 1)
## t = 20.826, df = 51, p-value < 2.2e-16
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  0.9077255 0.9685800
## sample estimates:
##      cor
## 0.9459323

B = lm(M1$X7 ~ log(EstimacionBC+1))
summary(B)

##
## Call:
## lm(formula = M1$X7 ~ log(EstimacionBC + 1))
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.17195 -0.06586 -0.01040  0.04901  0.17794
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept) -0.12921    0.02709  -4.77 1.58e-05 ***
## log(EstimacionBC + 1) 2.78131    0.13355   20.83 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.08659 on 51 degrees of freedom
## Multiple R-squared:  0.8948, Adjusted R-squared:  0.8927 
## F-statistic: 433.7 on 1 and 51 DF,  p-value: < 2.2e-16

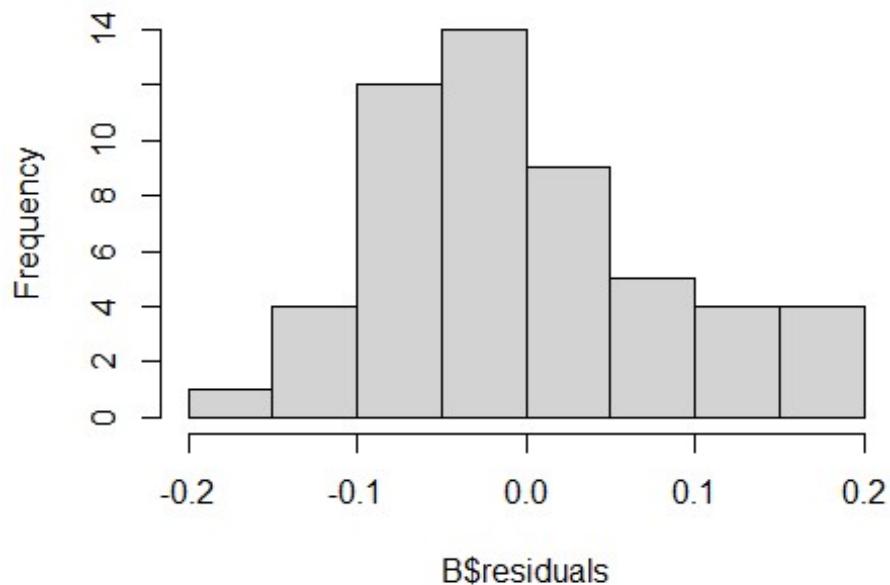
plot(B$fitted.values, B$residuals)
abline(h=0,col="red")

```



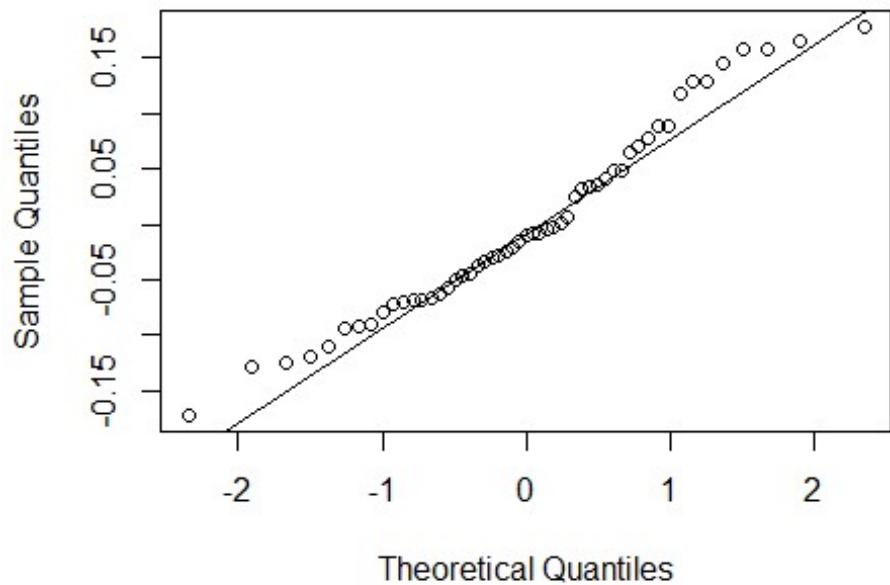
```
shapiro.test(B$residuals)
##
##  Shapiro-Wilk normality test
##
## data: B$residuals
## W = 0.9675, p-value = 0.1572
hist(B$residuals)
```

Histogram of B\$residuals



```
qqnorm(B$residuals)  
qqline(B$residuals)
```

Normal Q-Q Plot



```

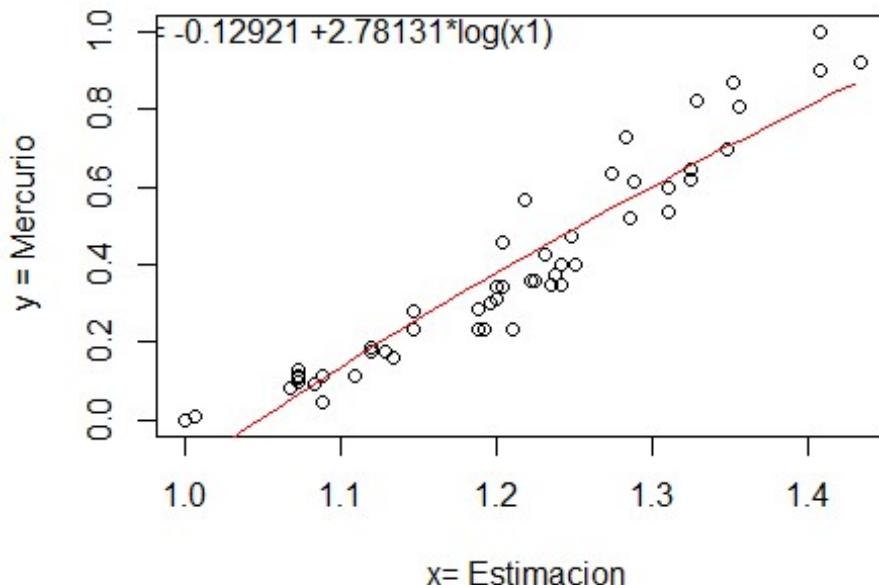
t.test(B$residuals)

##
##  One Sample t-test
##
## data: B$residuals
## t = 2.8057e-16, df = 52, p-value = 1
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.02363609 0.02363609
## sample estimates:
##   mean of x
## 3.304787e-18

x=EstimacionBC+1
y=M1$X7
plot(x, y, main = "Modelo Logaritmico", xlab =" x= Estimacion", ylab =" y = Mercurio")
x1 = seq(min(x), max(x), 0.01)
y1 = -0.12921 +2.78131*log(x1)
lines(x1, y1, col = "red")
text(1.1, 1, "y = -0.12921 +2.78131*log(x1)")

```

Modelo Logaritmico



```

q1=quantile(M$X7,0.25) #Cuantil 1 de la variable X
q2=quantile(M$X7,0.5)
q3=quantile(M$X7,0.75)

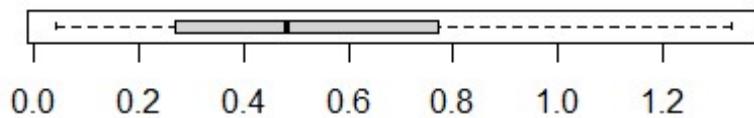
```

```

y1=min(M$X7)
y2=max(M$X7)
ri=IQR(M$X7)      #Rango intercuartílico de X 2x1

par(mfrow=c(2,1))  #Matriz de gráficos de 2x1
boxplot(M$X7, horizontal=TRUE, ylim=c(y1,y2))
abline(v=q3+1.5*ri, col="red") #Línea vertical en el límite de los datos
atípicos o extremos

```

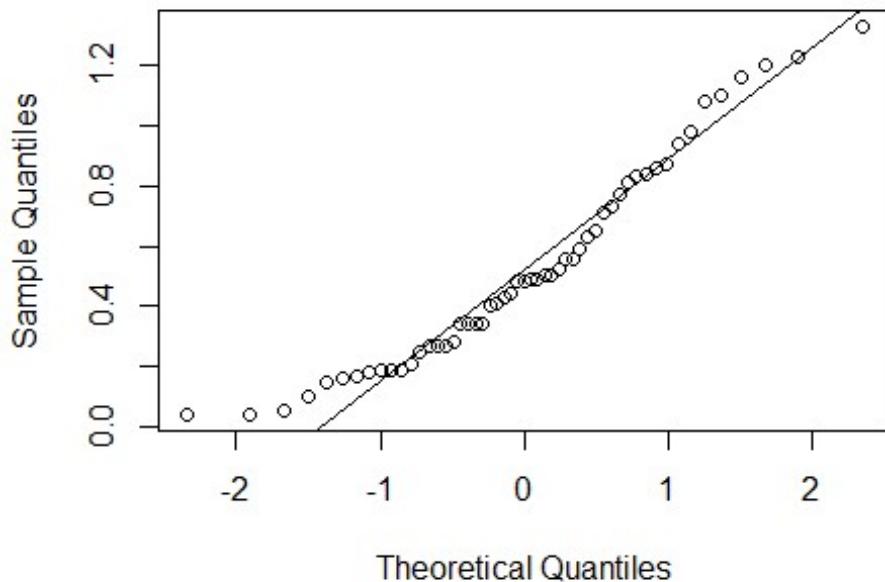


```

Concentracion_promedio= M[M$X7<q3+1.5*ri, c("X7")] #En la matriz M, quitar
datos más allá de 3 rangos intercuartílicos arriba de q3 de la variable X
qqnorm(Concentracion_promedio)
qqline(Concentracion_promedio)

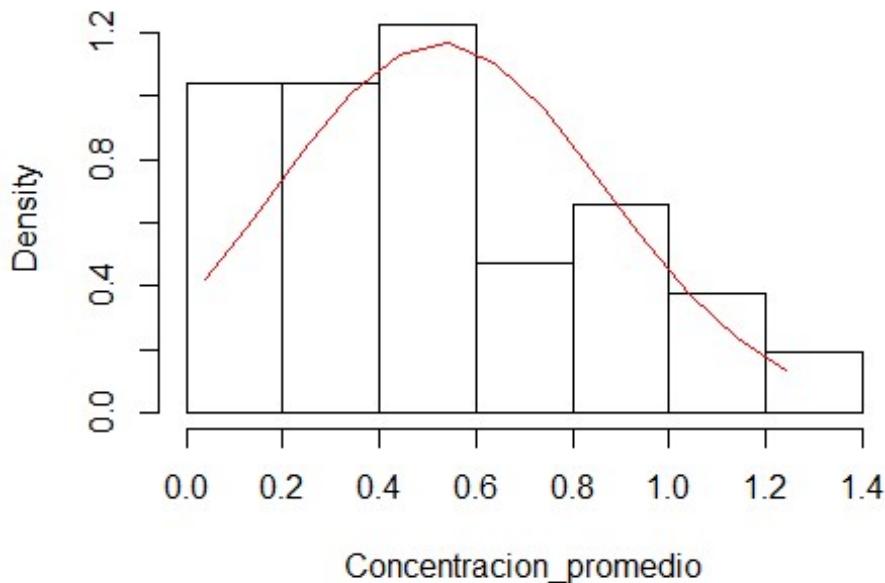
```

Normal Q-Q Plot



```
hist(Concentracion_promedio, prob=TRUE, col=0)
x=seq(min(Concentracion_promedio),max(Concentracion_promedio),0.1)
y=dnorm(x,mean(Concentracion_promedio),sd(Concentracion_promedio))
lines(x,y,col="red")
```

Histogram of Concentracion_promedio



```
library(moments)
skewness(Concentracion_promedio)

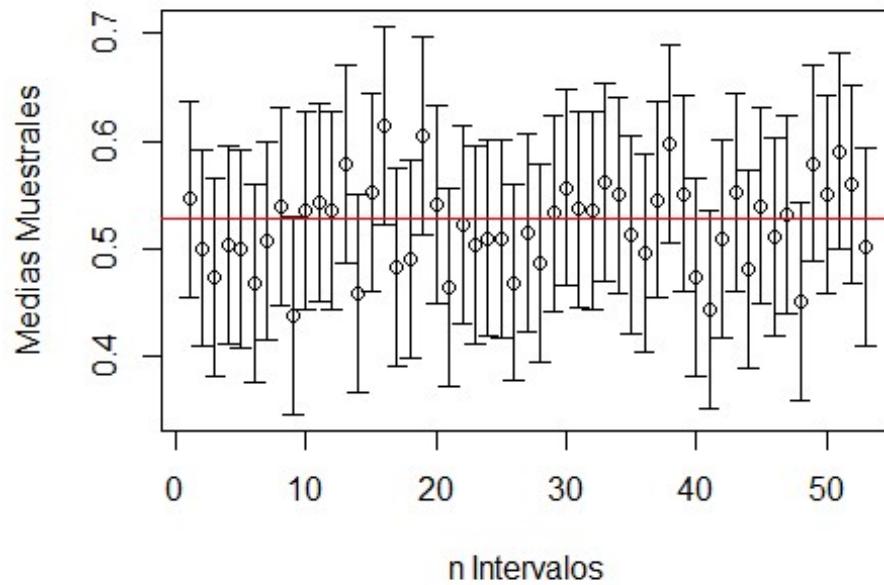
## [1] 0.6159853

kurtosis(Concentracion_promedio)

## [1] 2.460721

library(plotrix)
n=length(Concentracion_promedio)
media=mean(Concentracion_promedio)
DE=sd(Concentracion_promedio)
alfa=0.05
ErrorEst=DE/sqrt(n)
X_=rnorm(n,media>ErrorEst)
E=abs(qnorm(alfa/2))*DE/sqrt(n)
plotCI(1:n,X_,E,main="Gráfico de IC",,xlab="n Intervalos",ylab="Medias
Muestrales")
abline(h=media,col="red")
```

Gráfico de IC



```
cat("El promedio es de: ",media," +- ",E)
## El promedio es de: 0.5271698 +- 0.09181421
```

El valor promedio de concentración media de mercurio en los peces es de 0.5271 ppm con un intervalo de confianza de 0.091 ppm haciendo uso de un 95% de confianza lo que nos determina que en los lagos con menor concentración el valor no sobrepasa la medida propuesta como nociva para el consumo humano que es de 0.5 ppm pero en general los datos si llegan a sobrepasar este valor por lo que no recomendaría el consumir los alimentos recolectados en estos lagos en específico.

```
age=M$X12
conc=M$X7
anova<-aov(conc ~ age)
summary(anova)

##           Df Sum Sq Mean Sq F value Pr(>F)
## age         1  0.072  0.07151    0.61   0.438
## Residuals  51  5.976  0.11718

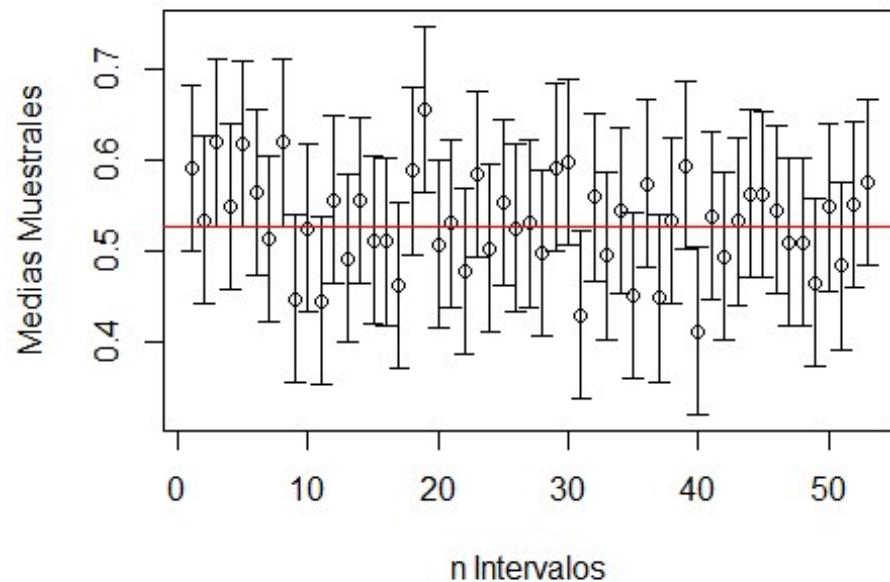
library(BSDA)

## Warning: package 'BSDA' was built under R version 4.1.3

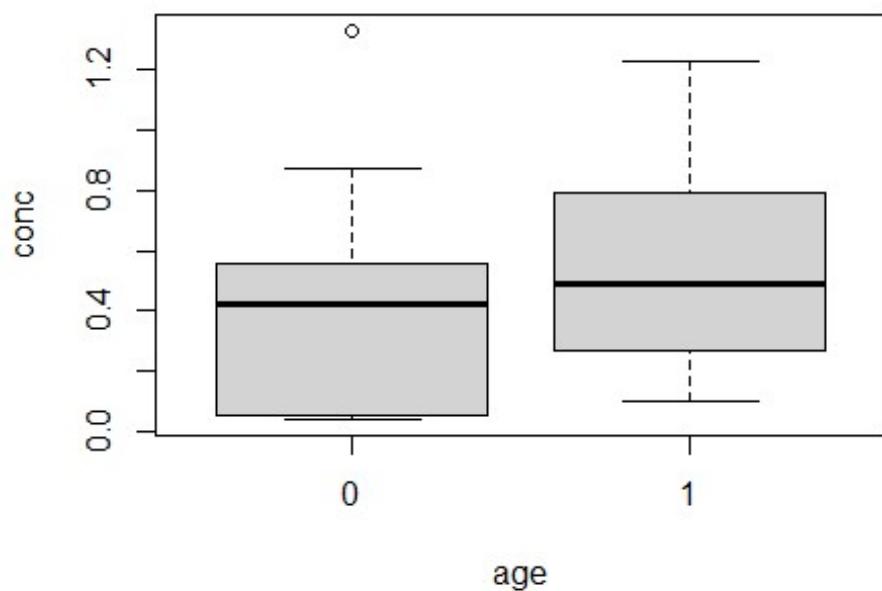
## Loading required package: lattice

##
## Attaching package: 'BSDA'
```

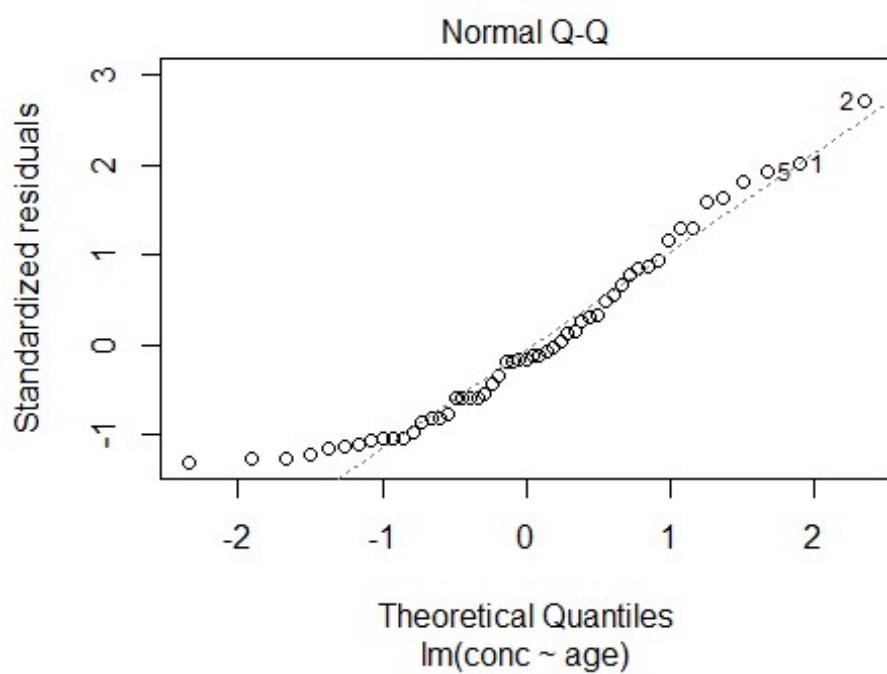
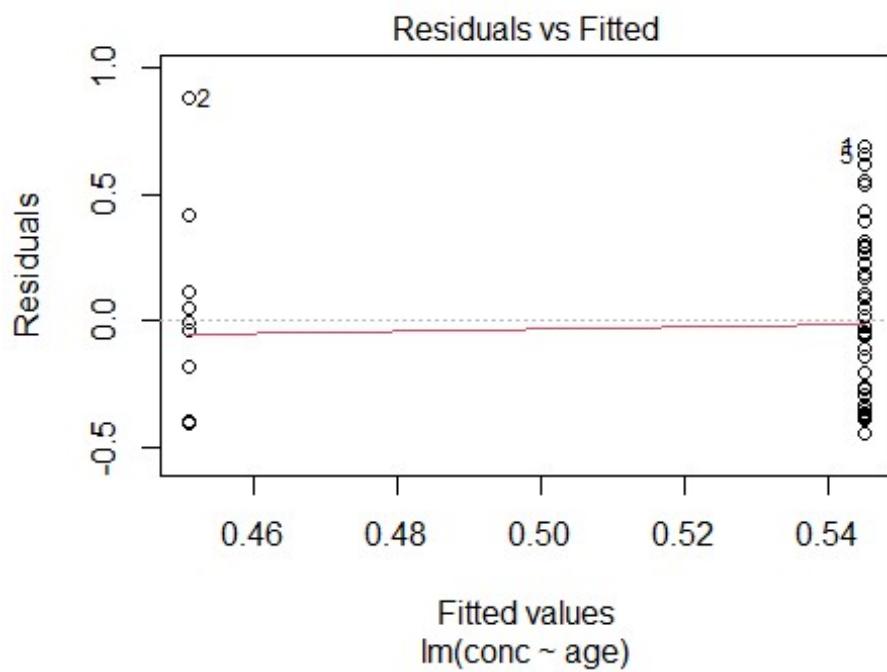

Gráfico de IC

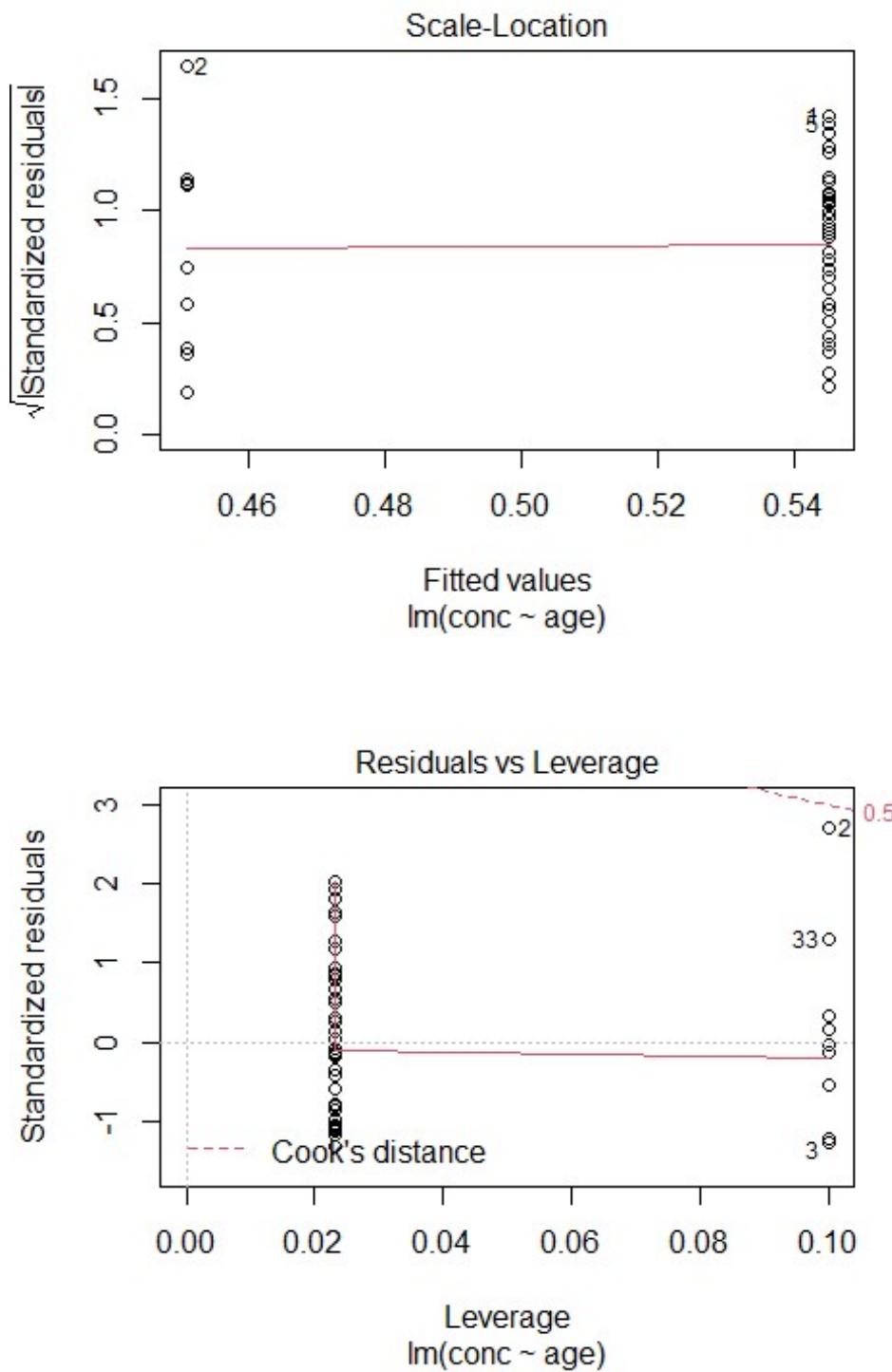


```
boxplot(conc ~ age)
```



```
plot(lm(conc~age))
```





CD= $150/(150+76)$ #coeficiente de determinación para el modelo.
CD

```
## [1] 0.6637168
```

```

## Análisis de cada tratamiento
m = tapply(conc, age, mean)
cat("Media de la concentración de mercurio por la edad de los peces:", m,
"\n")

## Media de la concentración de mercurio por la edad de los peces: 0.451
0.5448837

s = tapply(conc,age , sd)
cat("Desviación estandar de la concentración de mercurio por la edad de los peces:", s, "\n")

## Desviación estandar de la concentración de mercurio por la edad de los peces: 0.4076614 0.3266232

n = tapply(conc, age, length)
cat("Tamaño de la muestra de la concentración de mercurio por la edad de los peces:", n, "\n")

## Tamaño de la muestra de la concentración de mercurio por la edad de los peces: 10 43

## Intervalos de confianza
sm = s/sqrt(n)
E = abs(qt(0.025,n-1))*sm

In = m - E
cat("Intervalos de confianza inferiores:", In, "\n")

## Intervalos de confianza inferiores: 0.1593766 0.4443639

Sup = m + E
cat("Intervalos de confianza superiores:", Sup, "\n")

## Intervalos de confianza superiores: 0.7426234 0.6454035

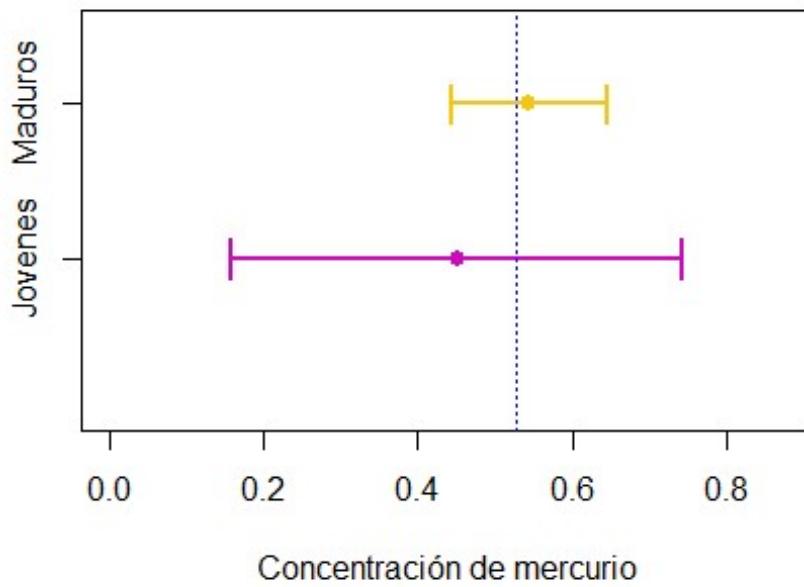
plot(0, ylim=c(0,2.5), xlim=c(0,.87597), yaxt="n",
ylab="",xlab="Concentración de mercurio", main="Concentración de mercurio en los peces")
axis(2,at=c(1:2),labels=c("Jovenes","Maduros"))

for(i in 1:2)
{
arrows(In[i],i,Sup[i],i, angle=90, code=3, length = 0.1, lwd = 2,col=i+5)
points(m[i], i, pch=19, cex=1.1,col=i+5)
}

abline(v=mean(conc),lty=3,col="blue")

```

Concentración de mercurio en los peces



Basandonos en este modelo podemos llegar a la conclusion de que la edad del pez no afecta a la concentracion de mercurio en estos ya que todos los datos se encuentran dentro del mismo intervalo de confianza. Generando asi una distribucion similar.