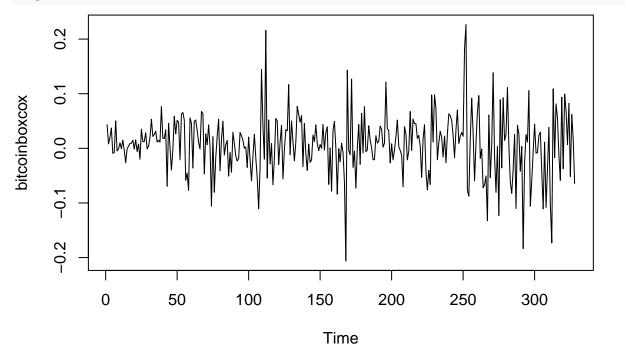
Bitcoin Time Series

Group Kappa 3/8/2018

```
#Reading in data
data <- read.csv("crypto.csv", header=TRUE)</pre>
#Choosing only Bitcoin
newdata <- subset(data, symbol=="BTC")</pre>
#Choosing the two variables
myvars <- c("date", "close")</pre>
crypto <- newdata[myvars]</pre>
#Changing class of "date"
crypto$date <- as.Date(crypto$date)</pre>
#Cutting off dates before 4/1/17
bitcoin <- subset(crypto, date > "2017-03-29")
#Creating the return variable
r.bitcoin = (bitcoin[2:nrow(bitcoin),2] / bitcoin[1:(nrow(bitcoin)-1),2]-1) + 1
#BoxCox Transform
time <- 1:length(r.bitcoin)</pre>
fit <- lm(r.bitcoin ~ time)</pre>
boxcoxtransform <- boxcox(r.bitcoin ~ time, plotit = T)</pre>
      က
              95%
log-Likelihood
      ^{\circ}
      0
              -2
                                                                       1
                                                                                         2
                                -1
                                                    0
lamb <- boxcoxtransform$x[which(boxcoxtransform$y == max(boxcoxtransform$y))]</pre>
bitcoinboxcox <- (1/lamb)*(r.bitcoin^lamb-1)</pre>
```

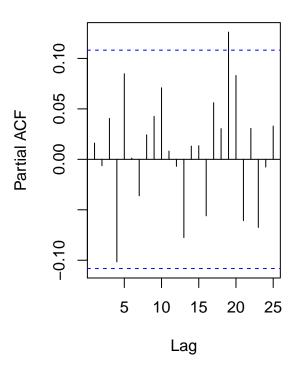
ts.plot(bitcoinboxcox)



#acf,pacf
op <- par(mfrow=c(1,2))
acf(bitcoinboxcox)
pacf(bitcoinboxcox)</pre>

Series bitcoinboxcox

Series bitcoinboxcox

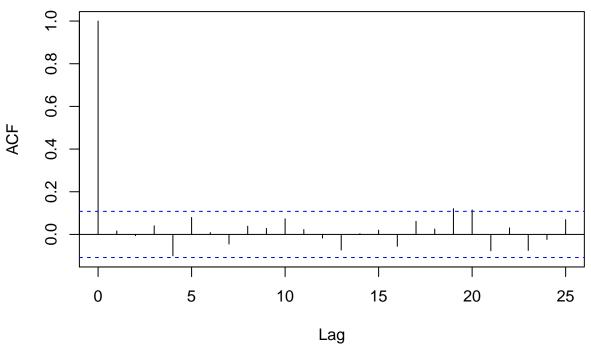


```
par(op)
```

White Noise Model

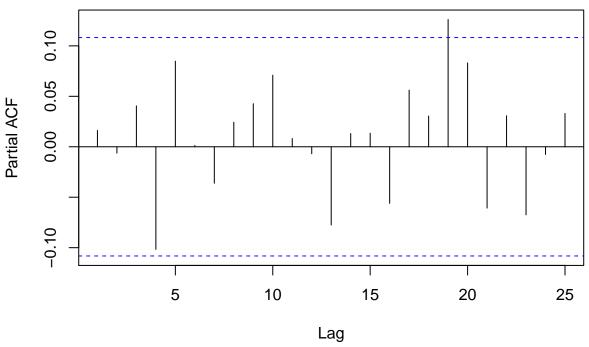
```
#MA(1) Model
fit = arima(bitcoinboxcox, order=c(0,0,0), method="ML")
#acf
acf(residuals(fit),main = "Autocorrelation")
```

Autocorrelation



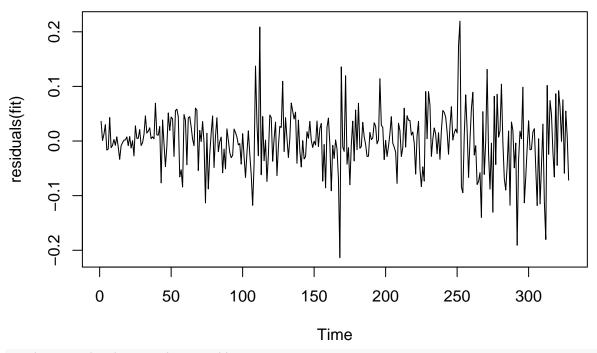
```
#pacf
pacf(residuals(fit),main = "Partial Autocorrelation")
```

Partial Autocorrelation



```
#Testing for independence of residuals
Box.test(resid(fit), type="Ljung")
##
##
   Box-Ljung test
## data: resid(fit)
## X-squared = 0.086284, df = 1, p-value = 0.769
\#Test\ for\ normality\ of\ residuals
shapiro.test(residuals(fit))
##
##
    Shapiro-Wilk normality test
##
## data: residuals(fit)
## W = 0.96744, p-value = 1.004e-06
#Plotting Residuals of Fit
ts.plot(residuals(fit),main = "Fitted Residuals")
```

Fitted Residuals

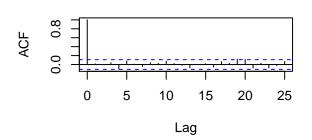


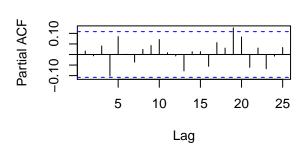
```
par(mfrow=c(1,2),oma=c(0,0,2,0))
# Plot diagnostics of residuals
op <- par(mfrow=c(2,2))
# acf
acf(residuals(fit),main = "Autocorrelation")
# pacf
pacf(residuals(fit),main = "Partial Autocorrelation")
# Histogram
hist(residuals(fit),main = "Histogram")
# q-q plot
qqnorm(residuals(fit))
qqline(residuals(fit)),col = "blue")
# Add overall title
title("Fitted Residuals Diagnostics for White Noise", outer=TRUE)</pre>
```

Fitted Residuals Diagnostics for White Noise

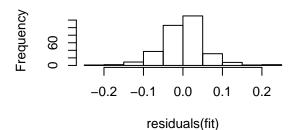
Autocorrelation

Partial Autocorrelation



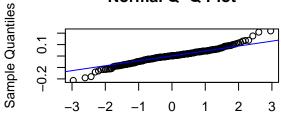


Histogram



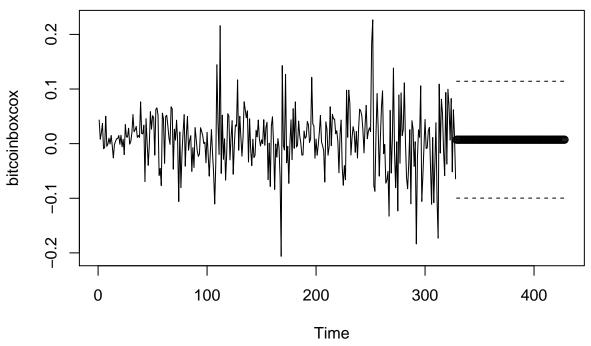
Normal Q-Q Plot

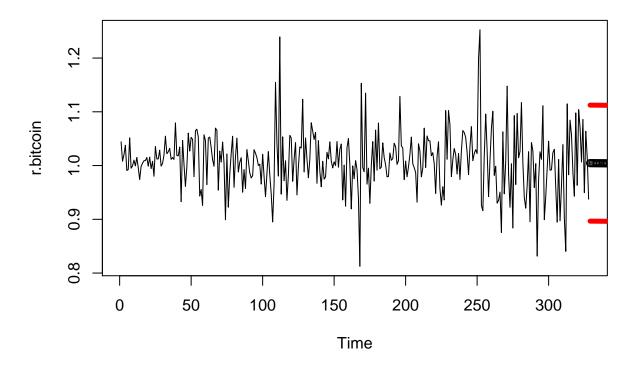
Theoretical Quantiles



par(op)

```
##Forecasting on bitcoinboxcox dataset with 100
mypred = predict(fit, n.ahead=100)
ts.plot(bitcoinboxcox, xlim=c(0,429))
points(x = 329:428, y = mypred$pred)
lines(329:428,mypred$pred+1.96*mypred$se,lty=2)
lines(329:428,mypred$pred-1.96*mypred$se,lty=2)
```

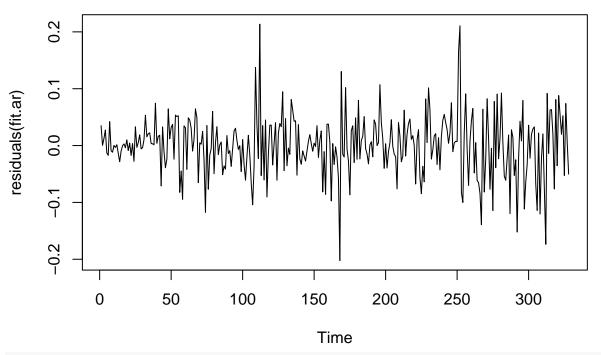




AR(18) Model

```
#AR(18) Model
fit.ar = arima(bitcoinboxcox, order=c(19,0,0), method="ML")
#Testing for independence of residuals
Box.test(resid(fit.ar), type="Ljung")
##
##
    Box-Ljung test
##
## data: resid(fit.ar)
## X-squared = 0.035084, df = 1, p-value = 0.8514
#Test for normality of residuals
shapiro.test(residuals(fit.ar))
##
##
    Shapiro-Wilk normality test
##
## data: residuals(fit.ar)
## W = 0.97412, p-value = 1.271e-05
#Plotting Residuals of Fit
ts.plot(residuals(fit.ar),main = "Fitted Residuals")
```

Fitted Residuals



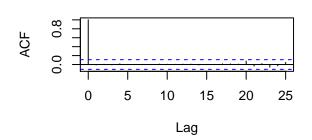
```
par(mfrow=c(1,2),oma=c(0,0,2,0))
# Plot diagnostics of residuals

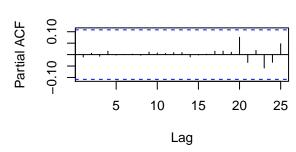
op <- par(mfrow=c(2,2))
# acf
acf(residuals(fit.ar),main = "Autocorrelation")
# pacf
pacf(residuals(fit.ar),main = "Partial Autocorrelation")
# Histogram
hist(residuals(fit.ar),main = "Histogram")
# q-q plot
qqnorm(residuals(fit.ar))
qqline(residuals(fit.ar),col ="blue")
# Add overall title
title("Fitted Residuals Diagnostics For AR", outer=TRUE)</pre>
```

Fitted Residuals Diagnostics For AR



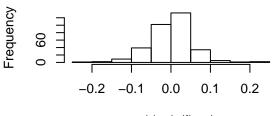
Partial Autocorrelation



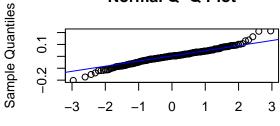


Histogram

Normal Q-Q Plot







Theoretical Quantiles

par(op)

```
##Forecasting AR Model on bitcoinboxcox dataset with 100
mypred = predict(fit.ar, n.ahead=100)
ts.plot(bitcoinboxcox, xlim=c(0,429))
points(x = 329:428, y = mypred$pred)
lines(329:428,mypred$pred+1.96*mypred$se,lty=2)
lines(329:428,mypred$pred-1.96*mypred$se,lty=2)
```

