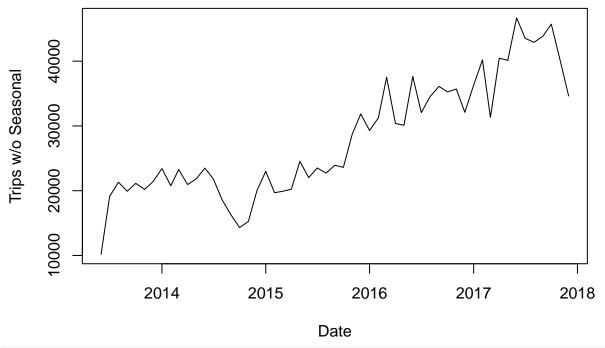
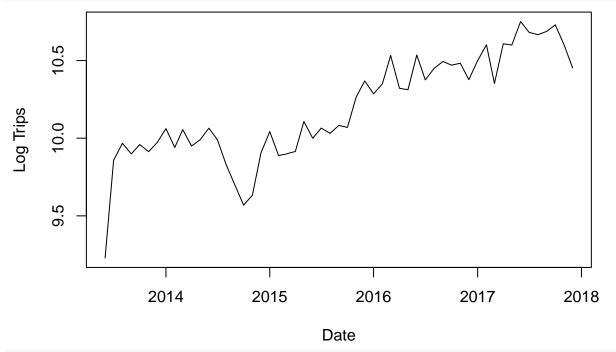
R Notebook

```
library("forecast")
data <- read.csv("/Users/chuamelia/Google Drive/Forecasting Time Series/citi-bike/aggTripsMonthly.csv")</pre>
date <- as.Date(data$MonthYear)</pre>
time <- 1:length(date)</pre>
trips <- data$woSeasonal</pre>
# Time series plot
plot(date, data$Trips, type="l",
     xlab="Date", ylab="Trips")
      30000
                     2014
                                     2015
                                                      2016
                                                                      2017
                                                                                       2018
                                                 Date
log.trips <- log(trips)</pre>
diff.log.trips <- c(NA, diff(log.trips))</pre>
diff2.log.trips <- c(NA, diff(diff.log.trips))</pre>
# Time series plot
plot(date, trips, type="l",
```

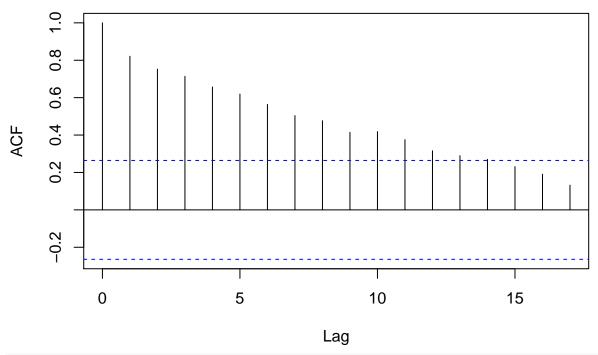
xlab="Date", ylab="Trips w/o Seasonal")





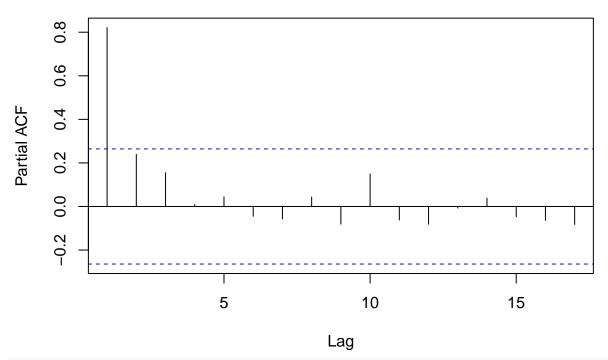
ACF and PACF
acf(log.trips, na.action = na.pass)

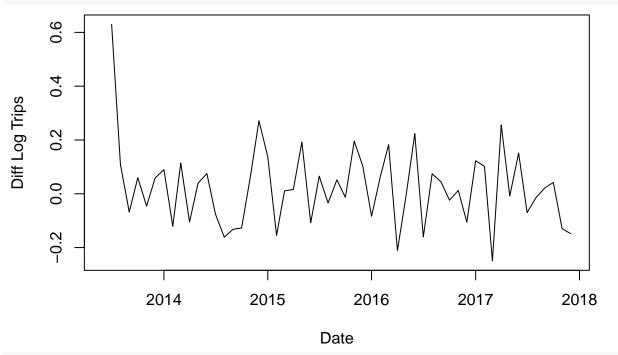
Series log.trips



pacf(log.trips, na.action = na.pass)

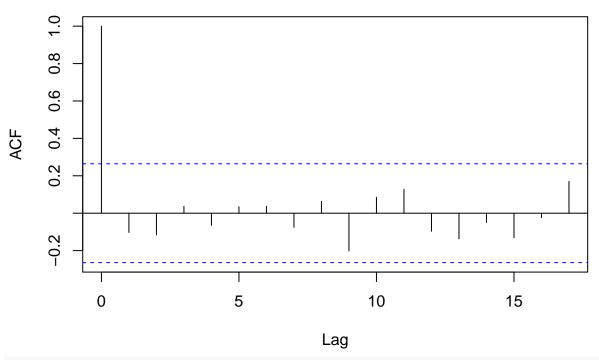
Series log.trips





ACF and PACF
acf(diff.log.trips, na.action = na.pass)

Series diff.log.trips

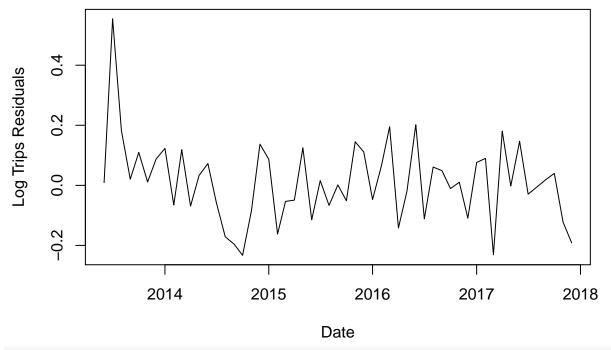


pacf(diff.log.trips, na.action = na.pass)

Series diff.log.trips

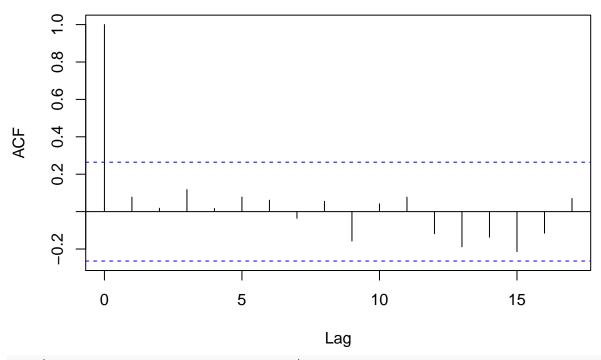
```
0.1
Partial ACF
      0.0
                               5
                                                    10
                                                                          15
                                               Lag
Arima(log.trips, c(0, 0, 0), include.constant=FALSE)$aicc
## [1] 413.5681
#Arima(log.trips, c(1, 0, 0), include.constant=FALSE)$aicc
Arima(log.trips, c(1, 0, 0), include.constant=TRUE)$aicc
## [1] -46.71975
Arima(log.trips, c(1, 1, 0), include.constant=TRUE)$aicc
## [1] -49.11246
Arima(log.trips, c(2, 1, 0), include.constant=TRUE)$aicc
## [1] -48.63872
Arima(log.trips, c(1, 2, 0), include.constant=TRUE)$aicc
## [1] -28.3975
Arima(log.trips, c(1, 1, 1), include.constant=TRUE)$aicc
## [1] -52.05159
Arima(log.trips, c(1, 1, 2), include.constant=TRUE)$aicc
## [1] -49.63884
fit <- Arima(log.trips, c(1, 1, 1), include.constant=TRUE)</pre>
print(fit)
## Series: log.trips
## ARIMA(1,1,1) with drift
```

```
##
## Coefficients:
                          drift
##
           ar1
                    ma1
         0.6491 -1.0000 0.0191
##
## s.e. 0.1290 0.0513 0.0030
##
## sigma^2 estimated as 0.01917: log likelihood=30.43
                             BIC=-44.91
               AICc=-52.05
## AIC=-52.87
# Hint: use Box.test function. You must call this function four times,
# for lags 12, 24, 36, and 48.
Box.test(log.trips, lag = 12, type = c("Box-Pierce", "Ljung-Box"), fitdf = 0)
## Box-Pierce test
##
## data: log.trips
## X-squared = 217.4, df = 12, p-value < 2.2e-16
Box.test(log.trips, lag = 24, type = c("Box-Pierce", "Ljung-Box"), fitdf = 0)
## Box-Pierce test
##
## data: log.trips
## X-squared = 237.7, df = 24, p-value < 2.2e-16
Box.test(log.trips, lag = 36, type = c("Box-Pierce", "Ljung-Box"), fitdf = 0)
##
## Box-Pierce test
##
## data: log.trips
## X-squared = 317.88, df = 36, p-value < 2.2e-16
Box.test(log.trips, lag = 48, type = c("Box-Pierce", "Ljung-Box"), fitdf = 0)
##
## Box-Pierce test
##
## data: log.trips
## X-squared = 355.33, df = 48, p-value < 2.2e-16
# Add TS plot, ACF, and PACF
resid.log.trips <- residuals(fit)</pre>
# Time series plot
plot(as.Date(data$MonthYear), resid.log.trips, type="1",
     xlab="Date", ylab="Log Trips Residuals")
```



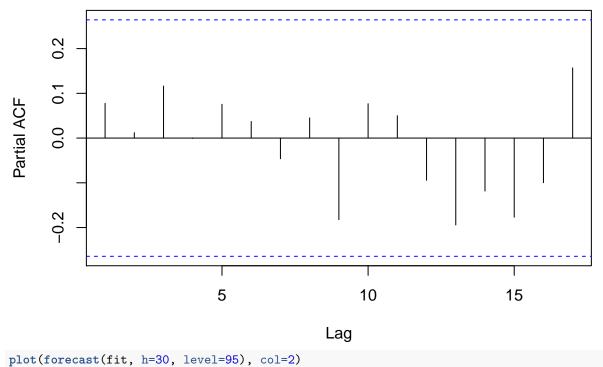
ACF and PACF
acf(resid.log.trips, na.action = na.pass)

Series resid.log.trips



pacf(resid.log.trips, na.action = na.pass)

Series resid.log.trips



Forecasts from ARIMA(1,1,1) with drift

