

ARIMA model Analysis (Time Series)

Ajinkya Ghodekar

Required Libraries

```
#install.packages("dplyr")
#install.packages("forecast")

library(dplyr)

##
## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':
##
##   filter, lag

## The following objects are masked from 'package:base':
##
##   intersect, setdiff, setequal, union

library(forecast)

## Registered S3 method overwritten by 'xts':
##   method      from
##   as.zoo.xts  zoo

## Registered S3 method overwritten by 'quantmod':
##   method      from
##   as.zoo.data.frame zoo

## Registered S3 methods overwritten by 'forecast':
##   method      from
##   fitted.fracdiff  fracdiff
##   residuals.fracdiff fracdiff
```

Including CSV file

```
rm(list=ls(all=TRUE))

tranData = read.csv(file = "F:\\OneDrive_1_21-06-2019\\transaction_data.csv")
```

Required data from CSV

```
quantity_zero = tranData[tranData$QUANTITY == 0 & tranData$SALES_VALUE > 0,]
```

```
summary(quantity_zero)
```

```
## household_key    BASKET_ID          DAY          PRODUCT_ID
## Min.   :  53    Min.   :2.713e+10    Min.   : 13.0    Min.   :  57059
## 1st Qu.: 505    1st Qu.:3.196e+10    1st Qu.:336.5    1st Qu.:  905799
## Median :1041    Median :3.317e+10    Median :419.0    Median :  986912
## Mean   :1148    Mean   :3.422e+10    Mean   :413.1    Mean   : 2431378
## 3rd Qu.:1796    3rd Qu.:3.579e+10    3rd Qu.:534.5    3rd Qu.: 1088048
## Max.   :2491    Max.   :4.168e+10    Max.   :665.0    Max.   :13945244
##      QUANTITY  SALES_VALUE          STORE_ID          RETAIL_DISC
## Min.   :  0    Min.   :0.0000    Min.   : 289.0    Min.   :0.00000
## 1st Qu.:  0    1st Qu.:0.0000    1st Qu.: 323.0    1st Qu.:0.00000
## Median :  0    Median :0.0100    Median : 368.0    Median :0.00000
## Mean   :  0    Mean   :0.2967    Mean   :2435.4    Mean   :0.05841
## 3rd Qu.:  0    3rd Qu.:0.0750    3rd Qu.: 422.5    3rd Qu.:0.00000
## Max.   :  0    Max.   :5.8200    Max.   :31782.0    Max.   :2.09000
##      TRANS_TIME    WEEK_NO    COUPON_DISC COUPON_MATCH_DISC
## Min.   :  41    Min.   : 3.00    Min.   : 0    Min.   : 0
## 1st Qu.:1328    1st Qu.:48.50    1st Qu.: 0    1st Qu.: 0
## Median :1544    Median :61.00    Median : 0    Median : 0
## Mean   :1555    Mean   :59.76    Mean   : 0    Mean   : 0
## 3rd Qu.:1850    3rd Qu.:77.00    3rd Qu.: 0    3rd Qu.: 0
## Max.   :2253    Max.   :96.00    Max.   : 0    Max.   : 0
```

```
quantity_gt_zero = tranData[!(tranData$QUANTITY == 0),]
```

```
summary(quantity_gt_zero)
```

```
## household_key    BASKET_ID          DAY          PRODUCT_ID
## Min.   :  1    Min.   :2.698e+10    Min.   :  1.0    Min.   :  25671
## 1st Qu.: 655    1st Qu.:3.014e+10    1st Qu.:220.0    1st Qu.:  916767
## Median :1271    Median :3.254e+10    Median :373.0    Median : 1027102
## Mean   :1271    Mean   :3.356e+10    Mean   :371.1    Mean   : 2833218
## 3rd Qu.:1914    3rd Qu.:3.560e+10    3rd Qu.:526.0    3rd Qu.: 1131438
## Max.   :2500    Max.   :4.185e+10    Max.   :677.0    Max.   :18120301
##      QUANTITY  SALES_VALUE          STORE_ID          RETAIL_DISC
## Min.   :  1    Min.   : 0.000    Min.   :  1    Min.   : -180.0000
## 1st Qu.:  1    1st Qu.: 1.290    1st Qu.: 330    1st Qu.: -0.6900
## Median :  1    Median : 2.000    Median : 370    Median : -0.0500
## Mean   : 101    Mean   : 3.117    Mean   :3071    Mean   : -0.5436
## 3rd Qu.:  1    3rd Qu.: 3.490    3rd Qu.: 422    3rd Qu.:  0.0000
## Max.   :89638    Max.   :840.000    Max.   :34280    Max.   :  3.9900
##      TRANS_TIME    WEEK_NO    COUPON_DISC COUPON_MATCH_DISC
## Min.   :  0    Min.   : 1.0    Min.   : -55.93000    Min.   : -7.700000
## 1st Qu.:1307    1st Qu.:32.0    1st Qu.:  0.00000    1st Qu.:  0.000000
## Median :1614    Median :54.0    Median :  0.00000    Median :  0.000000
## Mean   :1562    Mean   :53.7    Mean   : -0.01253    Mean   : -0.002919
```

```
## 3rd Qu.:1844 3rd Qu.:76.0 3rd Qu.: 0.00000 3rd Qu.: 0.000000
## Max. :2359 Max. :97.0 Max. : 0.00000 Max. : 0.000000

t = select(quantity_gt_zero,WEEK_NO,SALES_VALUE,QUANTITY,RETAIL_DISC,COUPON_D
ISC,COUPON_MATCH_DISC,RETAIL_DISC)

summary(t)

## WEEK_NO SALES_VALUE QUANTITY RETAIL_DISC
## Min. : 1.0 Min. : 0.000 Min. : 1 Min. : -180.0000
## 1st Qu.:32.0 1st Qu.: 1.290 1st Qu.: 1 1st Qu.: -0.6900
## Median :54.0 Median : 2.000 Median : 1 Median : -0.0500
## Mean :53.7 Mean : 3.117 Mean : 101 Mean : -0.5436
## 3rd Qu.:76.0 3rd Qu.: 3.490 3rd Qu.: 1 3rd Qu.: 0.0000
## Max. :97.0 Max. :840.000 Max. :89638 Max. : 3.9900
## COUPON_DISC COUPON_MATCH_DISC
## Min. : -55.93000 Min. : -7.700000
## 1st Qu.: 0.00000 1st Qu.: 0.000000
## Median : 0.00000 Median : 0.000000
## Mean : -0.01253 Mean : -0.002919
## 3rd Qu.: 0.00000 3rd Qu.: 0.000000
## Max. : 0.00000 Max. : 0.000000
```

Formula

```
t$Actual_price = (t$SALES_VALUE - (t$RETAIL_DISC + t$COUPON_MATCH_DISC)/t$QUA
NTITY)
```

Time Series Data

```
ti = select(t,WEEK_NO,Actual_price)

u = aggregate( Actual_price ~ WEEK_NO , ti, sum)

sum(is.na(u))

## [1] 0
```

Explore the data

```
tsdata<- ts(u$Actual_price, frequency = 4)

start(tsdata)

## [1] 1 1

end(tsdata)

## [1] 25 1
```

```

class(tsddata)
## [1] "ts"

frequency(tsddata)
## [1] 4

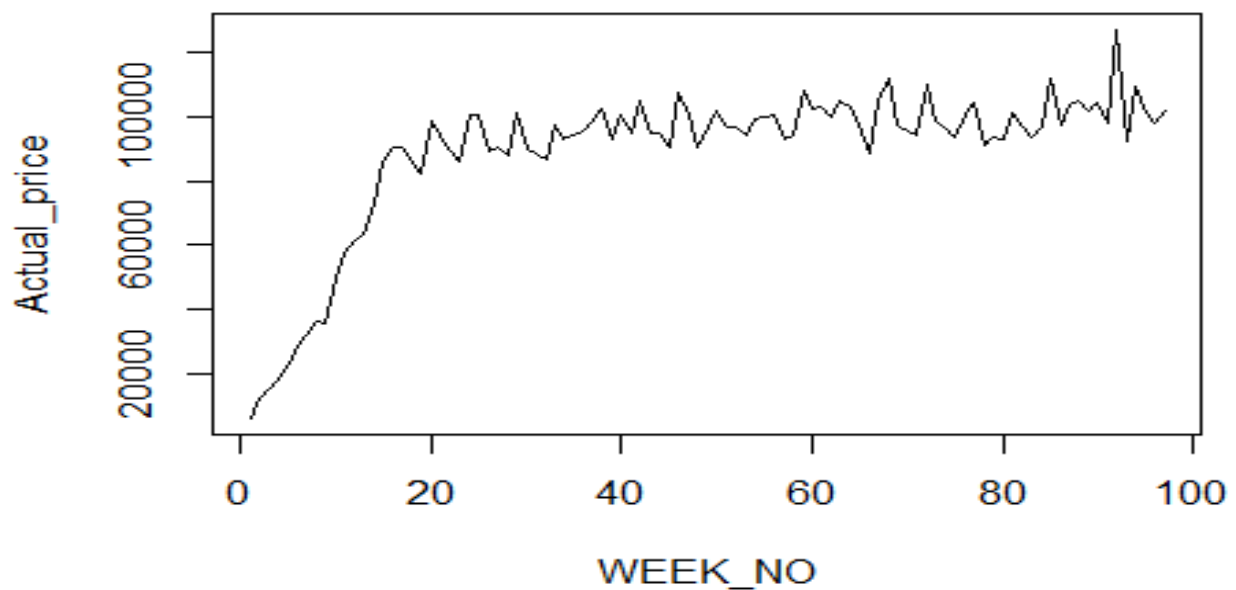
sum(is.na(tsddata))
## [1] 0

summary(tsddata)

##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##      6065   90181   95349   88791  100855  127147

plot(u,type = "l")

```



Multiplicative time series

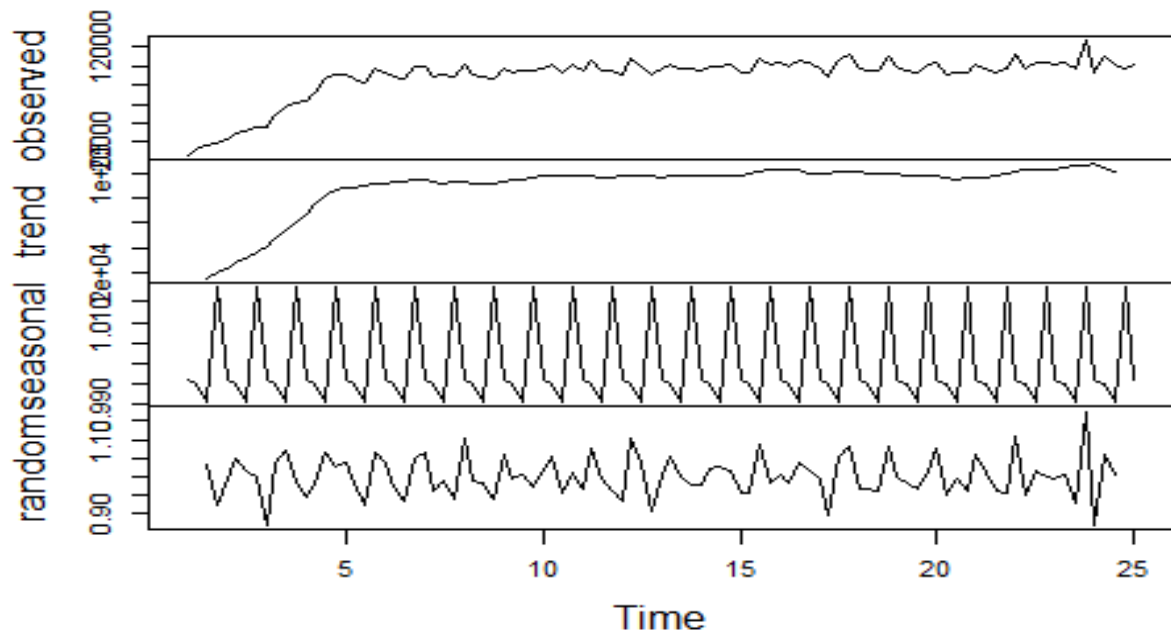
```

ddata<- decompose(tsddata, "multiplicative")

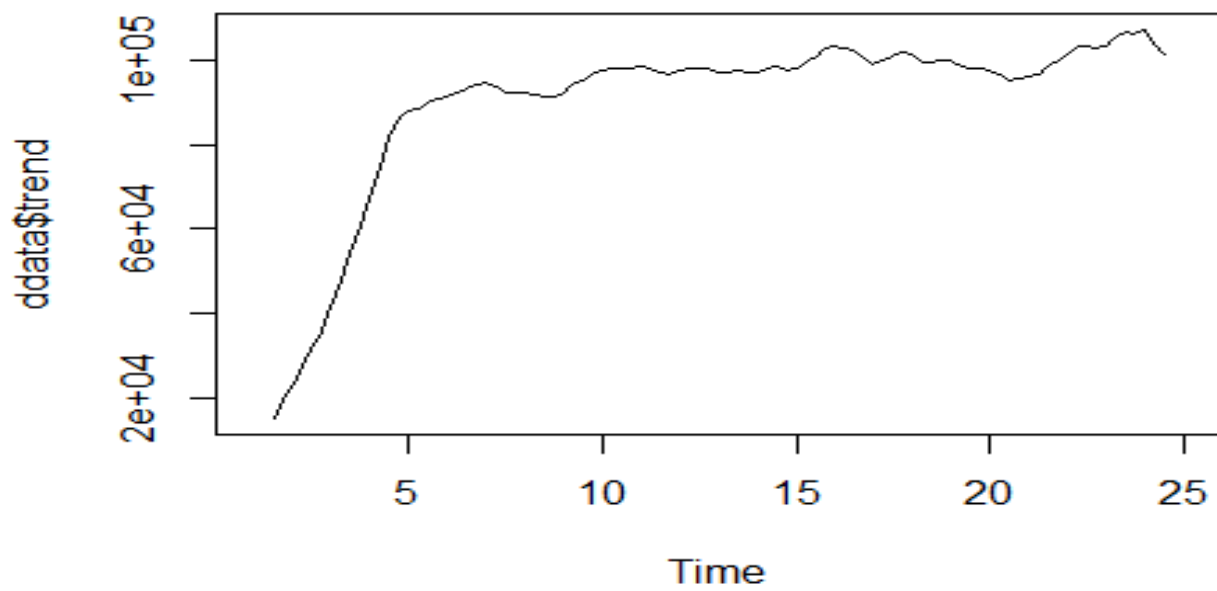
plot(ddata)

```

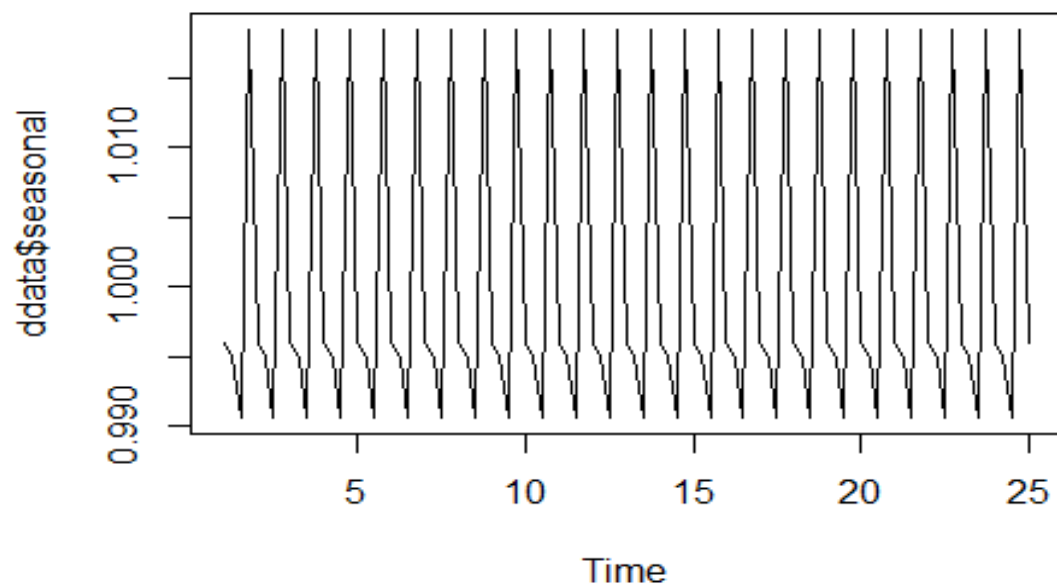
Decomposition of multiplicative time series



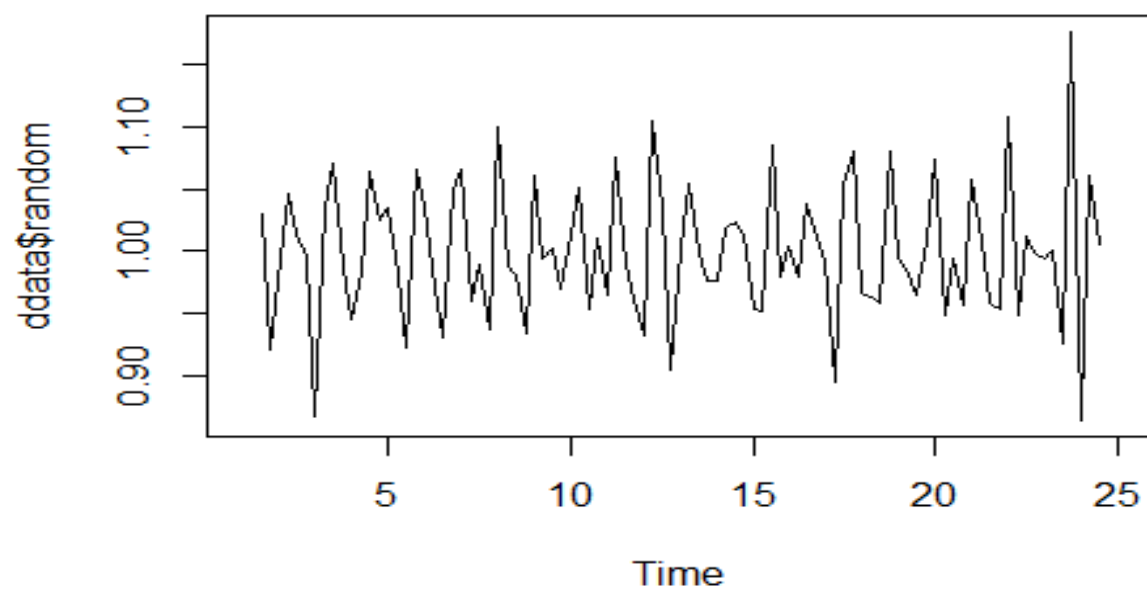
```
plot(ddata$trend)
```



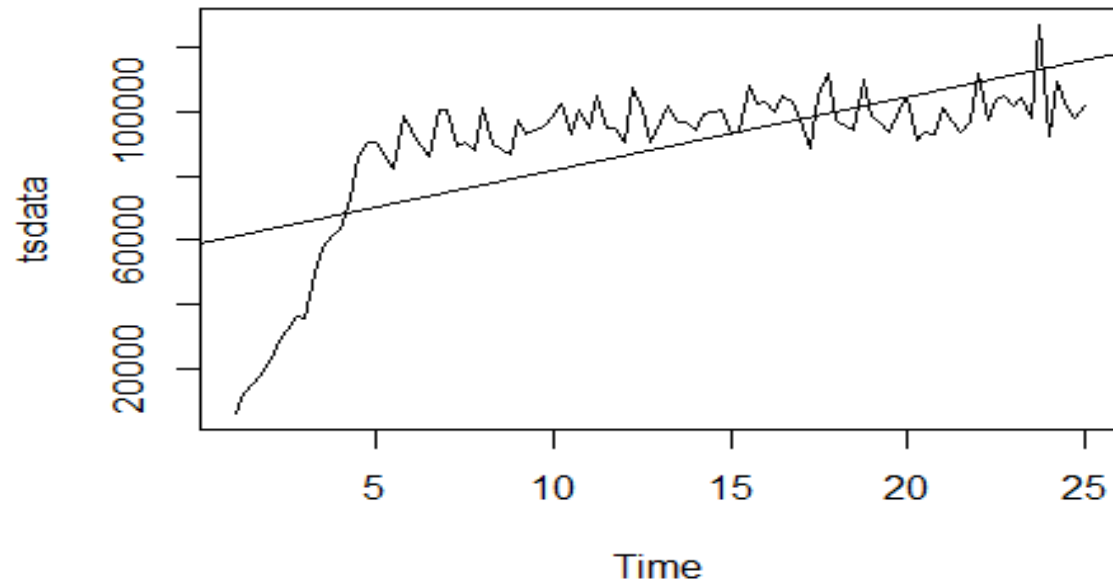
```
plot(ddata$seasonal)
```



```
plot(ddata$random)
```



```
plot(tsddata)
abline(reg = lm(tsddata ~ time(tsddata)))
```



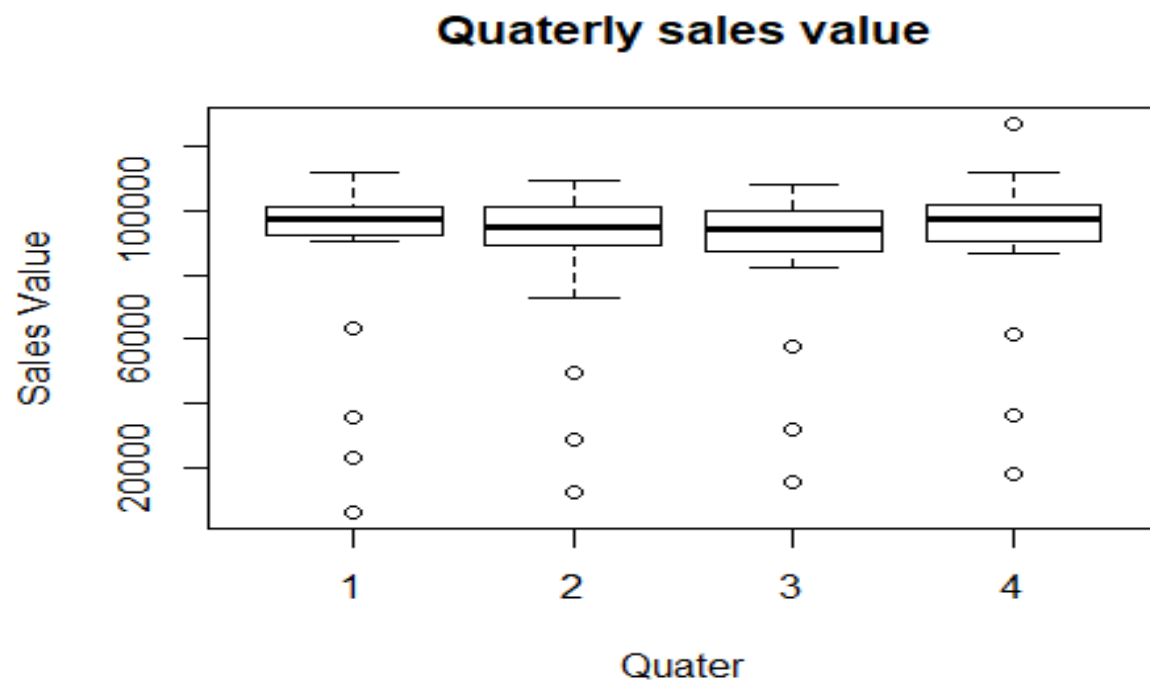
```
cycle(tsddata)
```

```
##      Qtr1 Qtr2 Qtr3 Qtr4
## 1       1    2    3    4
## 2       1    2    3    4
## 3       1    2    3    4
## 4       1    2    3    4
## 5       1    2    3    4
## 6       1    2    3    4
## 7       1    2    3    4
## 8       1    2    3    4
## 9       1    2    3    4
## 10      1    2    3    4
## 11      1    2    3    4
## 12      1    2    3    4
## 13      1    2    3    4
## 14      1    2    3    4
## 15      1    2    3    4
## 16      1    2    3    4
## 17      1    2    3    4
## 18      1    2    3    4
## 19      1    2    3    4
## 20      1    2    3    4
```

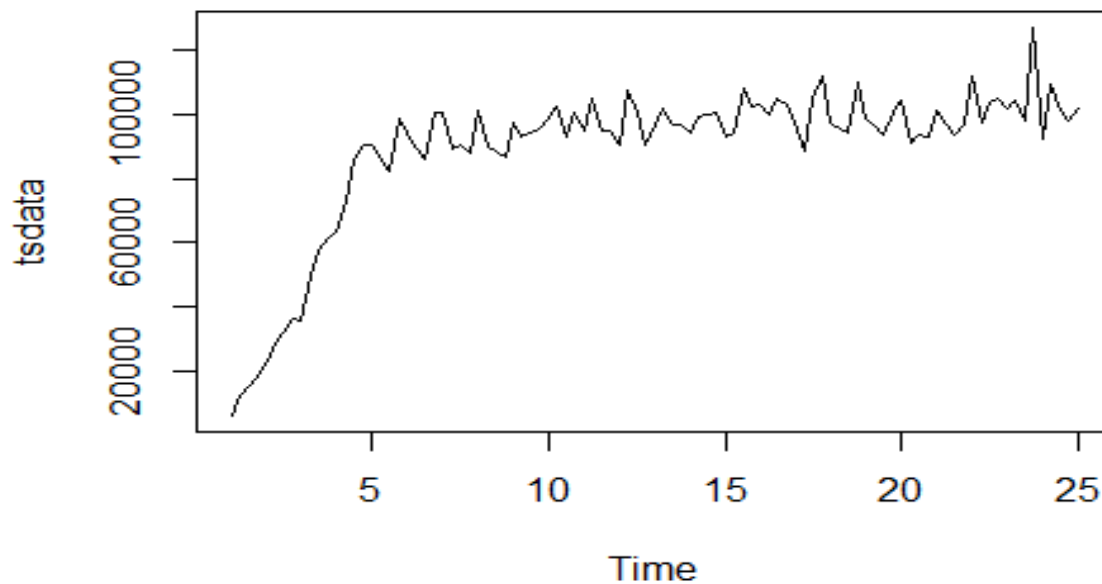
```
## 21    1    2    3    4
## 22    1    2    3    4
## 23    1    2    3    4
## 24    1    2    3    4
## 25    1
```

Box plot of a cycle

```
boxplot(tsddata ~ cycle(tsddata) , xlab = "Quater" , ylab= "Sales Value", main
= "Quaterly sales value")
```



```
plot(tsddata)
```

Creating ARIMA Model

```
mymodel <- auto.arima(ts(u$Actual_price[0:95]))
```

```
mymodel
```

```
## Series: ts(u$Actual_price[0:95])
## ARIMA(0,2,2)
##
## Coefficients:
##          ma1      ma2
##       -1.6089  0.7573
## s.e.   0.0750  0.0910
##
## sigma^2 estimated as 55637305: log likelihood=-962.01
## AIC=1930.02  AICc=1930.29  BIC=1937.62
```

```
auto.arima(ts(u$Actual_price[0:95]) , ic = 'aic' , trace = TRUE )
```

```
##
## ARIMA(2,2,2) : 1932.161
## ARIMA(0,2,0) : 2054.973
## ARIMA(1,2,0) : 2002.355
## ARIMA(0,2,1) : 1964.374
## ARIMA(1,2,2) : 1931.972
## ARIMA(0,2,2) : 1930.022
```

```
## ARIMA(0,2,3) : 1931.928
## ARIMA(1,2,1) : 1946.12
## ARIMA(1,2,3) : 1933.854
##
## Best model: ARIMA(0,2,2)

## Series: ts(u$Actual_price[0:95])
## ARIMA(0,2,2)
##
## Coefficients:
##          ma1      ma2
##      -1.6089  0.7573
## s.e.   0.0750  0.0910
##
## sigma^2 estimated as 55637305: log likelihood=-962.01
## AIC=1930.02 AICc=1930.29 BIC=1937.62
```

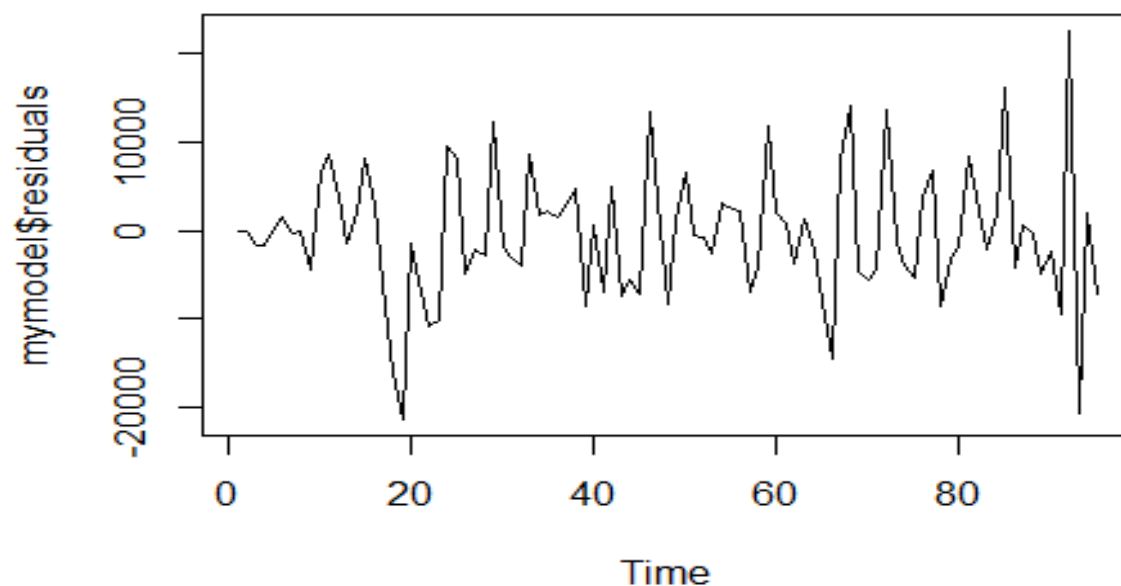
Required Libraries

```
#install.packages("tseries")
```

```
library(tseries)
```

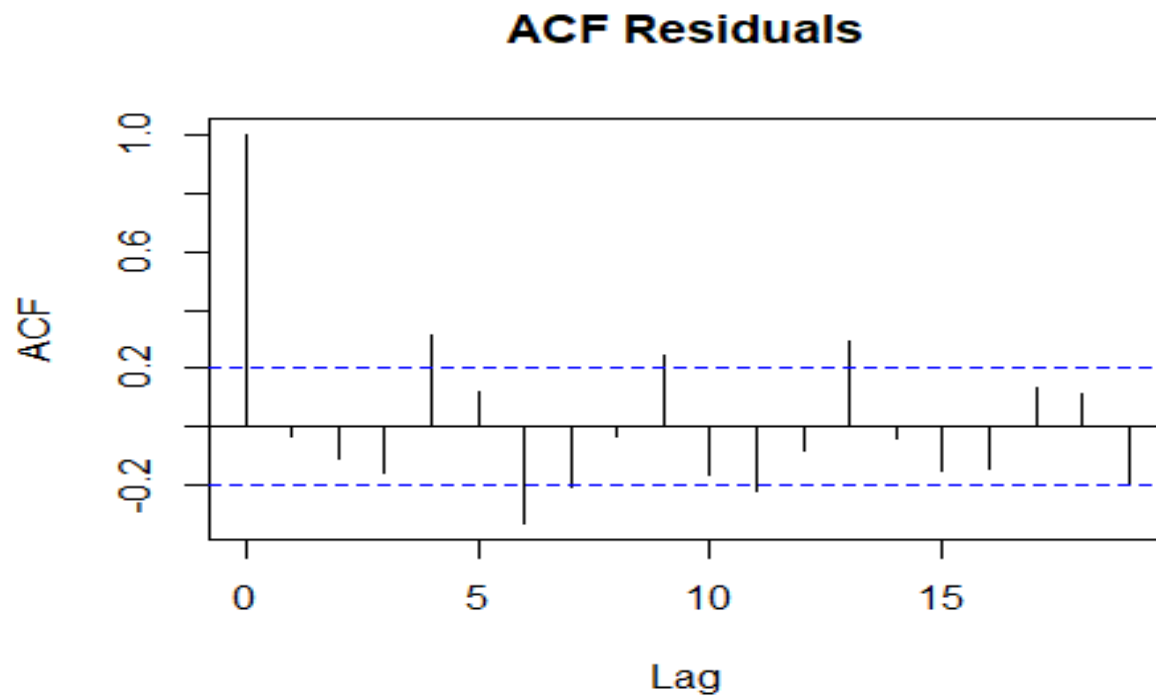
Plot the Residuals

```
plot(mymodel$residuals)
```



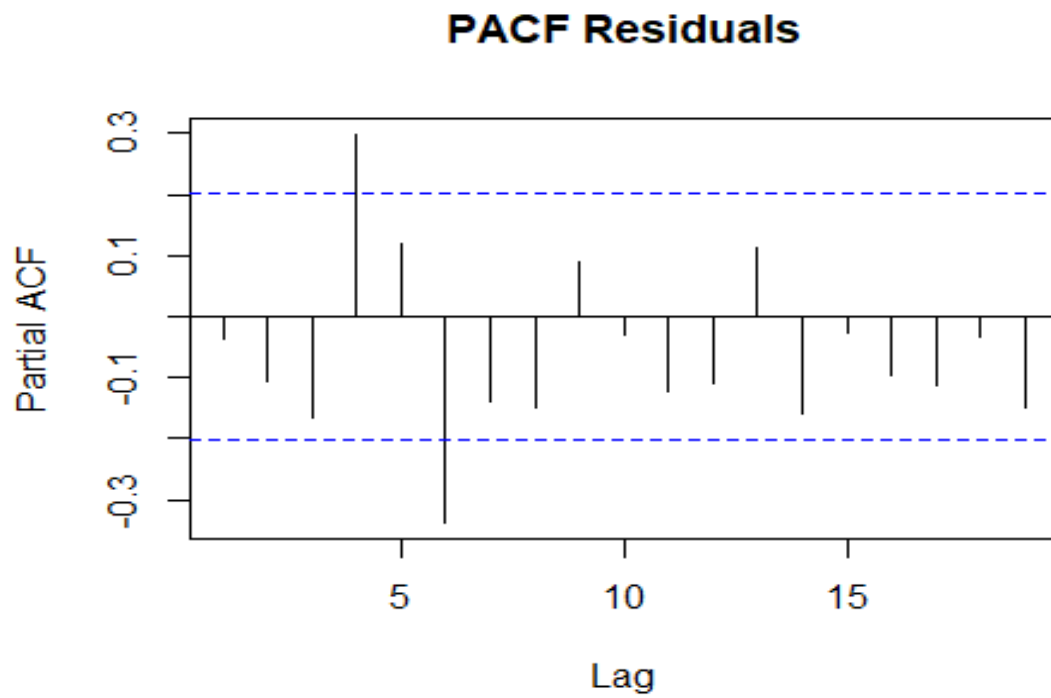
Autocorrelation Function

```
acf(ts(mymodel$residuals), main = "ACF Residuals")
```



Partial Autocorrelation Function

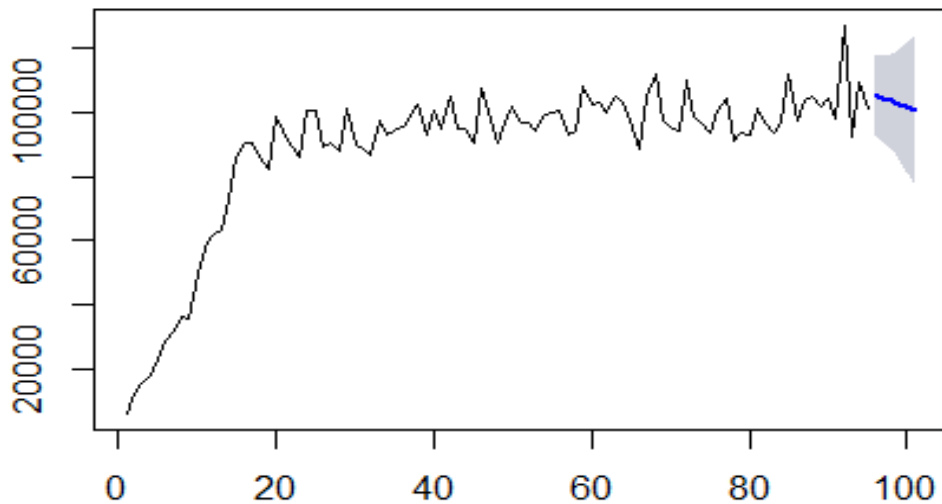
```
pacf(ts(mymodel$residuals), main = "PACF Residuals")
```



Forecast prediction for Week_No 98

```
myforecast <- forecast(mymodel, level = c(90), h=6)  
plot(myforecast)
```

Forecasts from ARIMA(0,2,2)



```
myforecast
```

```
##      Point Forecast    Lo 90    Hi 90
##  96      105531.6  93262.62 117800.7
##  97      104565.4  91391.32 117739.5
##  98      103599.1  88855.69 118342.6
##  99      102632.9  85644.76 119621.0
## 100      101666.6  81820.57 121512.7
## 101      100700.4  77466.64 123934.1
```

See the Forecasted values

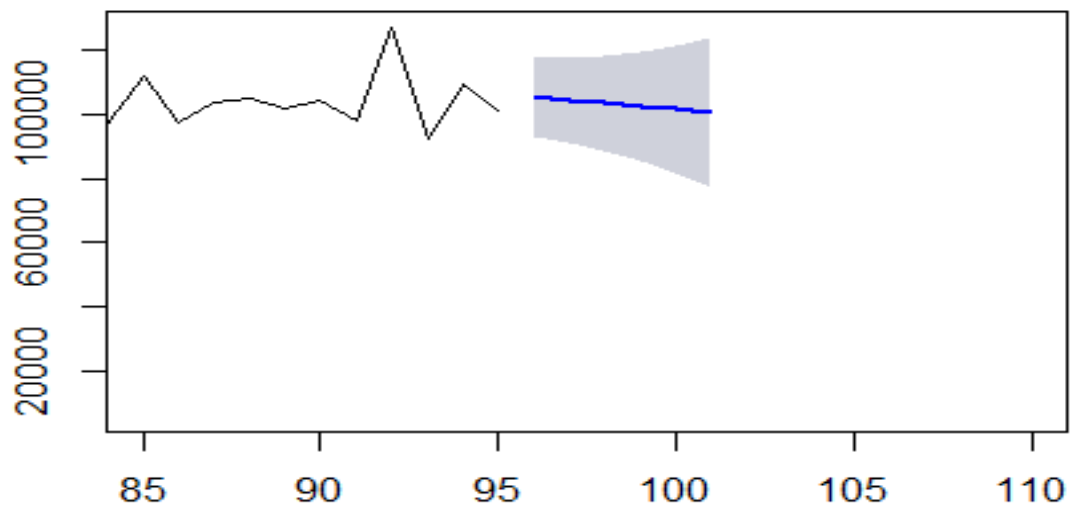
```
myforecast$mean
```

```
## Time Series:
## Start = 96
## End = 101
## Frequency = 1
## [1] 105531.6 104565.4 103599.1 102632.9 101666.6 100700.4
```

Plot last observations and the forecast

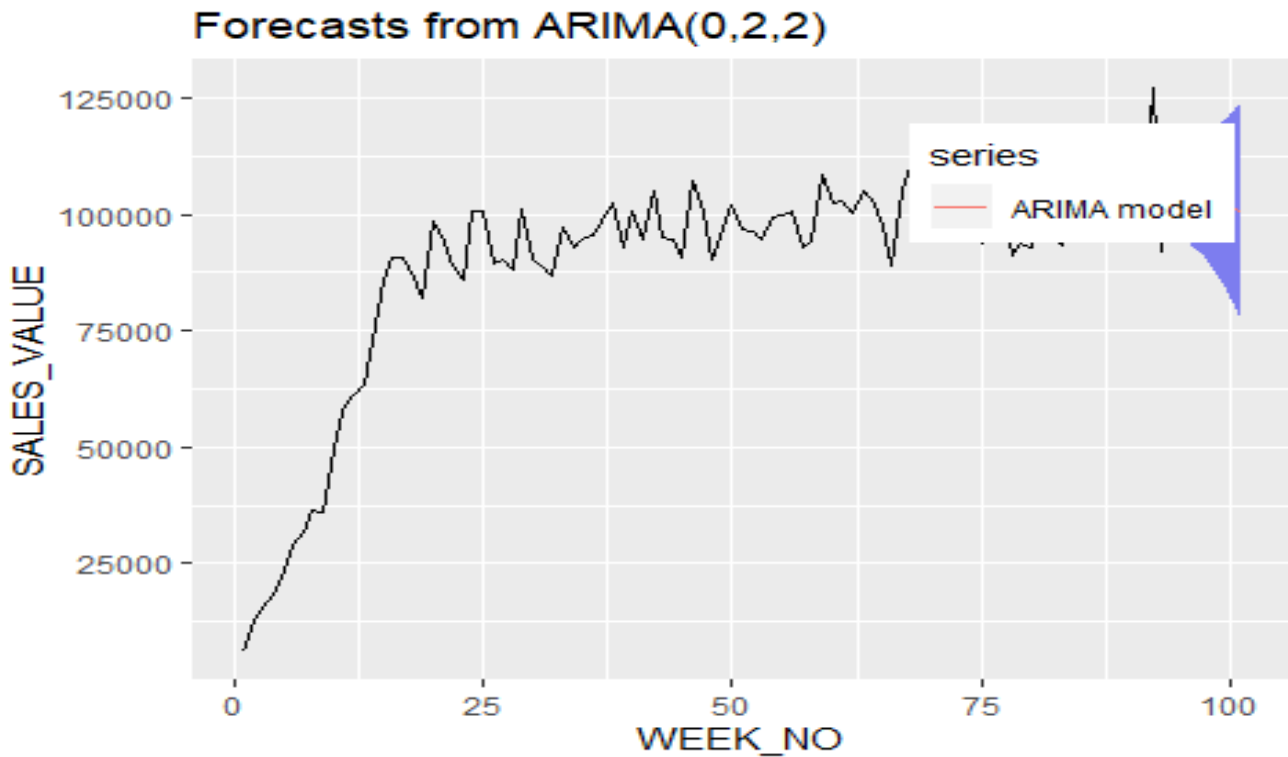
```
plot(myforecast, xlim = c(85, 110))
```

Forecasts from ARIMA(0,2,2)



Comparison plot for 2 models

```
library(ggplot2)
autoplot(myforecast)+
  forecast::autolayer(myforecast$mean,
                      series = 'ARIMA model') +
  xlab('WEEK_NO') +
  ylab('SALES_VALUE') +
  guides(
    colour = guide_legend(
      Title = 'Forecast Method')) +
  theme(
    legend.position = c(0.8, 0.8))
```



Box test

```
Box.test(mymodel$residuals,lag = 4, type = "Ljung-Box")
```

```
##  
## Box-Ljung test  
##  
## data: mymodel$residuals  
## X-squared = 13.648, df = 4, p-value = 0.008507
```

```
Box.test(mymodel$residuals,lag = 1, type = "Ljung-Box")
```

```
##  
## Box-Ljung test  
##  
## data: mymodel$residuals  
## X-squared = 0.12203, df = 1, p-value = 0.7268
```

```
Box.test(mymodel$residuals,lag = 2, type = "Ljung-Box")
```

```
##  
## Box-Ljung test  
##  
## data: mymodel$residuals  
## X-squared = 1.231, df = 2, p-value = 0.5404
```