# Forecasting Models

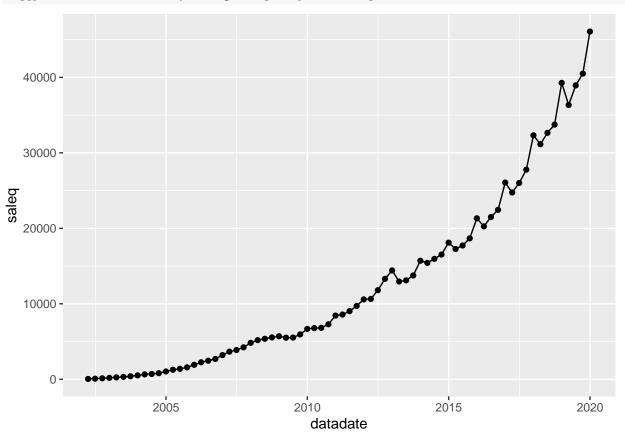
Haya Naviwala 5/12/2022

#### R Markdown

```
library(tidyverse)
## Registered S3 methods overwritten by 'tibble':
    method
              from
##
    format.tbl pillar
    print.tbl pillar
## -- Attaching packages ------ 1.3.0 --
## v ggplot2 3.3.5
                   v purrr
                              0.3.3
## v tibble 2.1.3 v dplyr 1.0.7
## v tidyr 1.0.0 v stringr 1.4.0
## v readr
          1.3.1
                    v forcats 0.4.0
## Warning: package 'ggplot2' was built under R version 3.6.2
## Warning: package 'dplyr' was built under R version 3.6.2
## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                   masks stats::lag()
library(lubridate)
##
## Attaching package: 'lubridate'
## The following object is masked from 'package:base':
##
##
      date
library(forecast)
## Warning: package 'forecast' was built under R version 3.6.2
## Registered S3 method overwritten by 'quantmod':
##
    method
    as.zoo.data.frame zoo
library(xts)
## Warning: package 'xts' was built under R version 3.6.2
## Loading required package: zoo
## Warning: package 'zoo' was built under R version 3.6.2
##
## Attaching package: 'zoo'
## The following objects are masked from 'package:base':
##
##
      as.Date, as.Date.numeric
```

```
##
## Attaching package: 'xts'
## The following objects are masked from 'package:dplyr':
##
       first, last
dt <- read_csv('google.csv')</pre>
## Parsed with column specification:
## cols(
    gvkey = col_double(),
##
##
    datadate = col_double(),
    fyearq = col_double(),
##
    fqtr = col_double(),
##
    tic = col_character(),
    datafqtr = col_character(),
##
##
     saleq = col_double()
## )
dt %>% glimpse()
## Observations: 72
## Variables: 7
             <dbl> 160329, 160329, 160329, 160329, 160329, 160329, 16032...
## $ gvkey
## $ datadate <dbl> 20020331, 20020630, 20020930, 20021231, 20030331, 200...
## $ fyearq <db1> 2002, 2002, 2002, 2002, 2003, 2003, 2003, 2003, 2004,...
## $ fqtr
              <dbl> 1, 2, 3, 4, 1, 2, 3, 4, 1, 2, 3, 4, 1, 2, 3, 4, 1, 2,...
              <chr> "GOOGL", "GOOGL", "GOOGL", "GOOGL", "GOOGL", "GOOGL", ...
## $ tic
## $ datafqtr <chr> "2002Q1", "2002Q2", "2002Q3", "2002Q4", "2003Q1", "20...
              <dbl> 42.285, 78.525, 130.787, 187.911, 248.618, 311.199, 3...
## $ saleq
dt %>% head(2)
## Warning: `...` is not empty.
## We detected these problematic arguments:
## * `needs_dots`
## These dots only exist to allow future extensions and should be empty.
## Did you misspecify an argument?
## # A tibble: 2 x 7
##
      gvkey datadate fyearq fqtr tic datafqtr saleq
      dbl>
               <dbl> <dbl> <chr> <chr>
                                                  <dbl>
## 1 160329 20020331
                       2002
                                1 GOOGL 2002Q1
                                                  42.3
## 2 160329 20020630
                       2002
                                2 GOOGL 2002Q2
                                                  78.5
dt %>% tail(2)
## Warning: `...` is not empty.
##
## We detected these problematic arguments:
## * `needs_dots`
## These dots only exist to allow future extensions and should be empty.
## Did you misspecify an argument?
## # A tibble: 2 x 7
```

```
gvkey datadate fyearq fqtr tic datafqtr saleq
##
      <dbl>
              <dbl> <dbl> <chr> <chr>
                                                 <dbl>
## 1 160329 20190930
                     2019
                               3 GOOGL 2019Q3
                                                 40499
## 2 160329 20191231
                       2019
                                4 GOOGL 2019Q4
                                                 46075
dt1 <- dt %>%
  mutate(datadate = ymd(datadate)) %>%
  arrange(datadate)
dt1 %>% head(2)
## Warning: `...` is not empty.
## We detected these problematic arguments:
## * `needs_dots`
## These dots only exist to allow future extensions and should be empty.
## Did you misspecify an argument?
## # A tibble: 2 x 7
##
      gvkey datadate
                      fyearq fqtr tic datafqtr saleq
      <dbl> <date>
                       <dbl> <dbl> <chr> <chr>
                                  1 GOOGL 2002Q1
## 1 160329 2002-03-31
                        2002
                                                    42.3
## 2 160329 2002-06-30
                        2002
                                  2 GOOGL 2002Q2
                                                    78.5
options(scipen=123)
dt1 %>%
 ggplot(aes(x=datadate, y=saleq)) + geom_point() + geom_line()
```

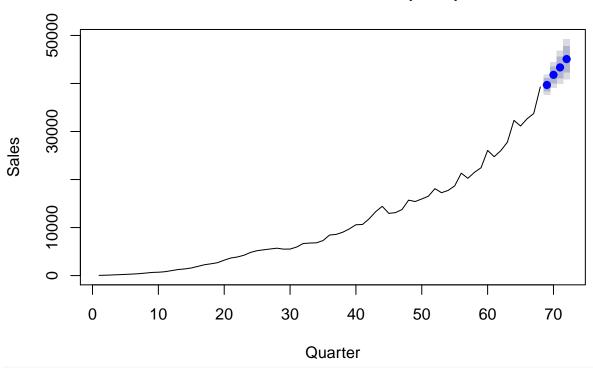


```
dtTest <- dt1 %>% arrange(desc(datadate)) %>% top_n(4, datadate)
dtTest
## Warning: `...` is not empty.
## We detected these problematic arguments:
## * `needs dots`
## These dots only exist to allow future extensions and should be empty.
## Did you misspecify an argument?
## # A tibble: 4 x 7
##
      gvkey datadate fyearq fqtr tic datafqtr saleq
      <dbl> <date>
                      <dbl> <dbl> <chr> <chr>
## 1 160329 2019-12-31 2019
                                 4 GOOGL 2019Q4
                                                   46075
## 2 160329 2019-09-30 2019
                                  3 GOOGL 2019Q3
                                                   40499
## 3 160329 2019-06-30
                                2 GOOGL 2019Q2
                       2019
                                                   38944
## 4 160329 2019-03-31
                       2019
                              1 GOOGL 2019Q1
                                                   36339
dtTrain <- dt1 %>%
  filter(!(datadate %in% dtTest$datadate)) %>% arrange(desc(datadate))
head(dtTrain, 2)
## Warning: `...` is not empty.
##
## We detected these problematic arguments:
## * `needs dots`
## These dots only exist to allow future extensions and should be empty.
## Did you misspecify an argument?
## # A tibble: 2 x 7
##
      gvkey datadate
                     fyearq fqtr tic datafqtr saleq
      <dbl> <date>
                        <dbl> <dbl> <chr> <chr>
                                                   <dbl>
## 1 160329 2018-12-31
                       2018
                              4 GOOGL 2018Q4
                                                   39276
## 2 160329 2018-09-30
                       2018
                                  3 GOOGL 2018Q3
                                                   33740
tail(dtTrain, 2)
## Warning: `...` is not empty.
## We detected these problematic arguments:
## * `needs dots`
##
## These dots only exist to allow future extensions and should be empty.
## Did you misspecify an argument?
## # A tibble: 2 x 7
##
      gvkey datadate
                      fyearq fqtr tic datafqtr saleq
##
      <dbl> <date>
                       <dbl> <dbl> <chr> <chr>
                                                   <dbl>
## 1 160329 2002-06-30
                                  2 GOOGL 2002Q2
                         2002
                                                    78.5
## 2 160329 2002-03-31
                         2002
                                  1 GOOGL 2002Q1
                                                    42.3
#NOTE: the xts data set shown below, the date is not considered a variable. It is just a indicator of t
dtxts_Train <- xts(dtTrain$saleq,</pre>
                   order.by = dtTrain$datadate)
```

```
head(dtxts_Train, 4)
                 [,1]
## 2002-03-31 42.285
## 2002-06-30 78.525
## 2002-09-30 130.787
## 2002-12-31 187.911
dtxts <- xts(dt1$saleq,
                   order.by = dt1$datadate)
head(dtxts_Train, 4)
##
                 [,1]
## 2002-03-31 42.285
## 2002-06-30 78.525
## 2002-09-30 130.787
## 2002-12-31 187.911
dtxts_Test <- xts(dtTest$saleq,</pre>
                  order.by = dtTest$datadate)
head(dtxts_Test)
##
               [,1]
## 2019-03-31 36339
## 2019-06-30 38944
## 2019-09-30 40499
## 2019-12-31 46075
Model1 <- auto.arima(dtxts_Train)</pre>
summary(Model1)
## Series: dtxts_Train
## ARIMA(1,2,1)
##
## Coefficients:
##
            ar1
##
        -0.3330 -0.8418
## s.e. 0.1373
                 0.0622
##
## sigma^2 estimated as 1132994: log likelihood=-553.59
## AIC=1113.18 AICc=1113.57 BIC=1119.75
##
## Training set error measures:
                      ME
                             RMSE
                                       MAE
                                                MPE
                                                         MAPE
                                                                   MASE
## Training set 202.0644 1032.641 573.0415 2.701254 5.407492 0.7391444
##
                       ACF1
## Training set -0.08618544
forecastedModel1 <- forecast(Model1,4)</pre>
forecastedModel1
                                          Lo 95
##
      Point Forecast
                        Lo 80
                                 Hi 80
                                                   Hi 95
          39683.92 38319.81 41048.03 37597.69 41770.15
## 69
## 70
           41799.38 40030.79 43567.98 39094.55 44504.21
           43346.27 41077.64 45614.90 39876.69 46815.84
## 71
## 72
           45082.48 42341.47 47823.49 40890.47 49274.50
```

```
plot(forecastedModel1, xlab = 'Quarter', ylab = 'Sales')
```

### Forecasts from ARIMA(1,2,1)



```
accuracy(forecastedModel1, dtxts_Test)
```

## ARIMA(0,2,2)

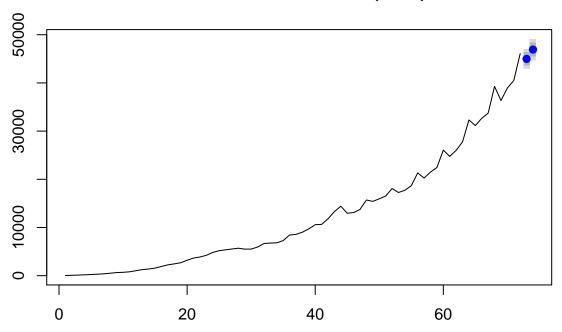
## Coefficients:

##

```
##
                         ME
                                RMSE
                                            MAE
                                                      MPE
                                                               MAPE
                                                                         MASE
## Training set
                   202.0644 1032.641 573.0415 2.701254 5.407492 0.7391444
## Test set
                -2013.7626 2666.164 2510.0219 -5.353278 6.430346 3.2375818
                        ACF1
## Training set -0.08618544
## Test set
#forecasting 2020
dt1xts <- xts(dt1$saleq, order.by = dt1$datadate)</pre>
head(dt1xts,2)
##
                 [,1]
## 2002-03-31 42.285
## 2002-06-30 78.525
tail(dt1xts,2)
##
                [,1]
## 2019-09-30 40499
## 2019-12-31 46075
Model2 <- auto.arima(dt1xts)</pre>
summary(Model2)
## Series: dt1xts
```

```
##
             ma1
##
         -1.6625
                  0.8511
          0.0665
                  0.0703
##
##
## sigma^2 estimated as 1112485: log likelihood=-587.69
                 AICc=1181.75
## AIC=1181.39
                                 BIC=1188.14
##
## Training set error measures:
##
                       ΜE
                              RMSE
                                        MAE
                                                 MPE
                                                         MAPE
                                                                    MASE
## Training set 139.2192 1025.027 616.9538 2.45016 5.961645 0.6779025
## Training set -0.03335
forecastedModel2 <- forecast(Model2, 2)</pre>
forecastedModel2
##
      Point Forecast
                         Lo 80
                                  Hi 80
                                           Lo 95
                                                     Hi 95
## 73
            44977.57 43625.86 46329.28 42910.30 47044.83
## 74
            46921.92 45495.29 48348.56 44740.07 49103.78
plot(forecastedModel2)
```

## Forecasts from ARIMA(0,2,2)



#### **Including Plots**

Note that the echo = FALSE parameter was added to the code chunk to prevent printing of the R code that generated the plot.