Time Series HW 5

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Assignment #5 - ARIMA Beer Sales

1984 13.6582 14.2932 12.4037 11.3818 ## 1985 13.5914 14.0102 12.3939 12.1101

#limit data to 1990

Load data from TSA package (the package is written by textbook authors Jonathan Cryer and Kung-Sik Chan).

```
library("TSA")
library("forecast")
library("zoo")
library("hydroGOF")

data(beersales)
```

The data is the monthly beer sales in millions of barrels, 01/1975 - 12/1990.

Part 1 use ARIMA(p,d,q) model to forecast beer sales for all months of 1990.

```
(beer.2 <- window(beersales, 1975, c(1989,12)))
##
            Jan
                    Feb
                            Mar
                                            May
                                                     Jun
                                                             Jul
                                    Apr
                                                                     Aug
## 1975 11.1179
                 9.8413 11.5732 13.0097 13.4182 14.4418 14.7534 13.8816
## 1976 10.8633 11.0000 10.9934 12.9140 13.5853 14.1553 15.0056 14.8590
## 1977 10.0067 10.4321 14.5477 14.2748 14.9986 15.7100 14.7980 14.6431
## 1978 10.6897 11.0093 14.7983 13.5984 14.9606 15.8187 15.2871 16.2773
## 1979 12.3244 12.0133 15.0094 14.9562 15.9268 15.5702 15.1282 15.5625
## 1980 12.5357 12.6446 14.0848 14.3271 16.1862 16.6604 17.0810 16.2811
## 1981 12.0798 12.4126 15.0092 15.4733 16.9966 17.2933 17.3701 16.2422
## 1982 11.9036 12.9126 15.6815 15.8119 16.5611 17.2255 16.1033 16.2590
## 1983 12.5696 12.6644 15.0723 15.5742 16.8397 17.0121 16.8476 17.3471
## 1984 12.4214 12.5443 15.3242 15.0629 16.8656 17.2300 17.3288 16.9654
## 1985 13.5114 12.7501 14.4642 15.8558 17.6043 16.1731 16.6319 16.0352
## 1986 13.9861 13.0120 14.6625 16.0165 17.1046 16.5952 17.0626 16.3092
## 1987 13.6094 13.7362 15.3119 15.9071 16.1350 16.6147 17.0362 15.8162
## 1988 13.8006 13.9416 15.2575 15.2452 16.4849 17.0435 16.4097 16.2246
## 1989 14.0913 13.1950 15.4059 14.8754 16.7768 16.9378 16.2259 17.4078
##
            Sep
                    Oct
                            Nov
## 1975 12.5123 11.8983 10.6088 11.5874
## 1976 13.4387 12.2184 10.5208 10.8335
## 1977 12.8878 11.6235 11.4853 11.5065
## 1978 13.9370 13.3270 12.0353 11.5670
## 1979 13.7112 13.6425 12.5158 11.7629
## 1980 14.5118 14.1594 12.5120 12.3830
## 1981 14.6808 13.8444 12.3871 12.9072
## 1982 14.8834 13.8291 13.1376 12.2662
## 1983 14.8442 13.8536 12.7904 11.9797
```

```
## 1986 14.0156 14.6417 12.4761 12.8391
## 1987 14.3066 14.4671 12.5856 12.3225
## 1988 14.4386 13.9469 13.2062 12.2347
## 1989 14.7684 14.3167 13.4048 12.0999
#fit the ARIMA(p,d,q)
(fit.beer <- auto.arima(beer.2, seasonal = FALSE))</pre>
## Series: beer.2
## ARIMA(1,1,3)
## Coefficients:
##
             ar1
                     ma1
                             ma2
                                     ma3
##
         -0.3636 0.3530 0.3702 0.6659
## s.e.
        0.1142 0.0856 0.0563 0.0626
##
## sigma^2 estimated as 1.086: log likelihood=-262.29
## AIC=534.58
               AICc=534.93
                             BIC=550.52
```

1A - Use the h-period in forecast() to forecast each month of 1990

```
#forecast all months of 1990
(pred.1990 <- forecast(fit.beer,h=12))</pre>
```

```
##
            Point Forecast
                               Lo 80
                                       Hi 80
                                                  Lo 95
                 11.97945 10.643826 13.31507 9.9367909 14.02210
## Jan 1990
## Feb 1990
                 11.71412 9.835280 13.59296 8.8406832 14.58756
## Mar 1990
                 11.65137 9.034864 14.26788 7.6497691 15.65297
## Apr 1990
                 11.67419 8.035420 15.31295 6.1091739 17.23920
## May 1990
                 11.66589 7.376389 15.95539 5.1056639 18.22612
## Jun 1990
                 11.66891 6.770653 16.56716 4.1776739 19.16014
## Jul 1990
                 11.66781 6.243221 17.09240 3.3716165 19.96400
## Aug 1990
                 11.66821 5.759124 17.57729 2.6310435 20.70537
                 11.66806 5.312961 18.02317 1.9487729 21.38735
## Sep 1990
## Oct 1990
                 11.66812 4.895744 18.44049 1.3106660 22.02557
## Nov 1990
                  11.66810 4.502907 18.83329 0.7098843 22.62631
## Dec 1990
                  11.66810 4.130473 19.20574 0.1402922 23.19592
```

1B - Use the monthly data as a continuous time series. Forecast for 1990 Jan, Plug forecast into the time series to forecast for 1990 Feb. And so on and so forth.

```
#initialize vectors to loop through each month
pred.loop.1990 <- vector(mode="list", length=13)
beer.loop <- vector(mode="list", length=13)
fit.beer.loop <- vector(mode="list", length=13)

beer.loop[[1]] <- beer.2
fit.beer.loop[[1]] <- fit.beer
#loop through each month, creating the forecast then merging the value onto the ts
for (i in 2:13) {</pre>
```

```
#forecast on previous beer table
(pred.loop.1990[[i]] <- forecast(fit.beer.loop[[i-1]],h=1)$mean)
#merge on new forecasted value
beer.loop[[i]] <- as.ts(c(as.zoo(beer.loop[[i-1]]),as.zoo(pred.loop.1990[[i]])))
#fit a new model with the new value included
(fit.beer.loop[[i]] <- auto.arima(beer.loop[[i]], seasonal = FALSE))

#check the final product
beer.loop[[13]]</pre>
```

```
##
                      Feb
                               Mar
                                        Apr
                                                 May
## 1975 11.11790 9.84130 11.57320 13.00970 13.41820 14.44180 14.75340
## 1976 10.86330 11.00000 10.99340 12.91400 13.58530 14.15530 15.00560
## 1977 10.00670 10.43210 14.54770 14.27480 14.99860 15.71000 14.79800
## 1978 10.68970 11.00930 14.79830 13.59840 14.96060 15.81870 15.28710
## 1979 12.32440 12.01330 15.00940 14.95620 15.92680 15.57020 15.12820
## 1980 12.53570 12.64460 14.08480 14.32710 16.18620 16.66040 17.08100
## 1981 12.07980 12.41260 15.00920 15.47330 16.99660 17.29330 17.37010
## 1982 11.90360 12.91260 15.68150 15.81190 16.56110 17.22550 16.10330
## 1983 12.56960 12.66440 15.07230 15.57420 16.83970 17.01210 16.84760
## 1984 12.42140 12.54430 15.32420 15.06290 16.86560 17.23000 17.32880
## 1985 13.51140 12.75010 14.46420 15.85580 17.60430 16.17310 16.63190
## 1986 13.98610 13.01200 14.66250 16.01650 17.10460 16.59520 17.06260
## 1987 13.60940 13.73620 15.31190 15.90710 16.13500 16.61470 17.03620
## 1988 13.80060 13.94160 15.25750 15.24520 16.48490 17.04350 16.40970
## 1989 14.09130 13.19500 15.40590 14.87540 16.77680 16.93780 16.22590
## 1990 11.97945 11.71413 11.65140 11.67432 11.66595 11.66896 11.66782
             Aug
                      Sep
                               Oct
## 1975 13.88160 12.51230 11.89830 10.60880 11.58740
## 1976 14.85900 13.43870 12.21840 10.52080 10.83350
## 1977 14.64310 12.88780 11.62350 11.48530 11.50650
## 1978 16.27730 13.93700 13.32700 12.03530 11.56700
## 1979 15.56250 13.71120 13.64250 12.51580 11.76290
## 1980 16.28110 14.51180 14.15940 12.51200 12.38300
## 1981 16.24220 14.68080 13.84440 12.38710 12.90720
## 1982 16.25900 14.88340 13.82910 13.13760 12.26620
## 1983 17.34710 14.84420 13.85360 12.79040 11.97970
## 1984 16.96540 13.65820 14.29320 12.40370 11.38180
## 1985 16.03520 13.59140 14.01020 12.39390 12.11010
## 1986 16.30920 14.01560 14.64170 12.47610 12.83910
## 1987 15.81620 14.30660 14.46710 12.58560 12.32250
## 1988 16.22460 14.43860 13.94690 13.20620 12.23470
## 1989 17.40780 14.76840 14.31670 13.40480 12.09990
## 1990 11.66829 11.66814 11.66819 11.66813 11.66816
```

1C - which of the two above approaches yield the better results in terms of Mean Squared Error 1990?

```
#create ts of 1990 actuals
beer1990 <- window(beersales,1990)</pre>
```

```
#calc MSE for first forecast
mse(pred.1990$mean,beer1990)

## [1] 15.96367

#calc MSE for second forecast
```

```
## [1] 15.96326
```

mse(window(beer.loop[[13]],1990),beer1990)

Based on the MSE calculations above, the 2 forecasts product very similar results but the first forecase (forecasting all 12 months at once) is marginally better.

Part 2 use month of the year seasonal ARIMA(p,d,q)(P,Q,D)s model to forecast beer sales for all the months of 1990.

```
#fit the ARIMA(p,d,q)(P,Q,D)s
(fit.s.beer <- auto.arima(beer.2, seasonal = TRUE))</pre>
## Series: beer.2
## ARIMA(4,1,2)(2,1,2)[12]
##
## Coefficients:
##
                                                                           sar2
            ar1
                      ar2
                               ar3
                                        ar4
                                                  ma1
                                                          ma2
                                                                  sar1
##
         0.5103
                 -0.1662
                           0.1032
                                    -0.3966
                                              -1.1757
                                                       0.3125
                                                                0.6838
                                                                        -0.592
## s.e.
         0.1453
                   0.0986
                           0.0863
                                     0.0789
                                               0.1492 0.1421 0.1451
                                                                         0.165
##
            sma1
                     sma2
         -1.1967
##
                   0.5849
## s.e.
          0.1394
                   0.2087
##
## sigma^2 estimated as 0.2667: log likelihood=-134.55
## AIC=291.1
                AICc=292.81
                              BIC=325.4
#forecast all months of 1990 with seasonality
(pred.s.1990 <- forecast(fit.s.beer,h=12))</pre>
```

```
##
            Point Forecast
                              Lo 80
                                       Hi 80
                                                 Lo 95
                                                          Hi 95
                  13.81601 13.15408 14.47794 12.80367 14.82835
## Jan 1990
## Feb 1990
                  13.07707 12.37905 13.77508 12.00955 14.14458
## Mar 1990
                  14.96181 14.25756 15.66607 13.88474 16.03888
## Apr 1990
                  15.58503 14.86058 16.30947 14.47709 16.69297
## May 1990
                  17.24847 16.51985 17.97709 16.13414 18.36280
## Jun 1990
                  16.86360 16.13286 17.59434 15.74602 17.98117
## Jul 1990
                  16.95571 16.22286 17.68856 15.83491 18.07651
## Aug 1990
                  17.02231 16.28757 17.75706 15.89862 18.14601
## Sep 1990
                  14.28619 13.53943 15.03295 13.14412 15.42826
## Oct 1990
                  14.55136 13.78375 15.31896 13.37741 15.72530
## Nov 1990
                  12.89695 12.11623 13.67766 11.70295 14.09094
                  12.30127 11.51036 13.09218 11.09168 13.51086
## Dec 1990
```

Part 3 Which model (Part 1 or Part 2) is better to forecast beer sales for each month of 1990 (Jan, Feb, ..., Dec) ?

```
#calc MSE for part 1 forecast
mse(pred.1990$mean,beer1990)
```

[1] 15.96367

```
#calc MSE for part 2 forecast
mse(pred.s.1990$mean,beer1990)
```

[1] 0.5650021

Based on the MSE calculations above, the part 2 forecast (the seasonal ARIMA) is considerably better. Using the seasonal ARIMA drastically reduces the MSE to ~ 0.57 (compared to the ~ 15.96 MSE from part 1)