Homework_1-Q1.R

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```
library(MASS)
library(forecast)
## Warning: package 'forecast' was built under R version 3.5.2
#install.packages("forecast")
data(Boston)
summary(Boston)
##
         crim
                                             indus
                             zn
                                                              chas
##
   Min.
           : 0.00632
                       Min.
                                         Min.
                                                         Min.
                                                                 :0.00000
                              :
                                 0.00
                                                : 0.46
   1st Qu.: 0.08204
##
                       1st Qu.:
                                 0.00
                                         1st Qu.: 5.19
                                                         1st Qu.:0.00000
##
   Median : 0.25651
                       Median :
                                 0.00
                                         Median : 9.69
                                                         Median :0.00000
##
          : 3.61352
                             : 11.36
   Mean
                       Mean
                                         Mean
                                                :11.14
                                                         Mean
                                                                 :0.06917
    3rd Qu.: 3.67708
                       3rd Qu.: 12.50
                                         3rd Qu.:18.10
##
                                                         3rd Qu.:0.00000
##
           :88.97620
                               :100.00
                                                :27.74
                                                         Max.
   Max.
                       Max.
                                         Max.
                                                                 :1.00000
##
                                                            dis
         nox
                           rm
                                           age
##
                                      Min.
   Min.
           :0.3850
                     Min.
                            :3.561
                                             : 2.90
                                                       Min.
                                                              : 1.130
                                                       1st Qu.: 2.100
    1st Qu.:0.4490
                                      1st Qu.: 45.02
##
                     1st Qu.:5.886
##
   Median :0.5380
                     Median :6.208
                                      Median : 77.50
                                                       Median : 3.207
                                                             : 3.795
##
   Mean
           :0.5547
                     Mean
                            :6.285
                                      Mean
                                             : 68.57
                                                       Mean
##
    3rd Qu.:0.6240
                     3rd Qu.:6.623
                                      3rd Qu.: 94.08
                                                       3rd Qu.: 5.188
##
   Max.
           :0.8710
                             :8.780
                                      Max.
                                             :100.00
                                                       Max.
                                                              :12.127
                     Max.
##
                                                          black
         rad
                          tax
                                         ptratio
                             :187.0
##
   Min.
           : 1.000
                     Min.
                                      Min.
                                             :12.60
                                                      Min.
                                                             : 0.32
    1st Qu.: 4.000
                     1st Qu.:279.0
                                      1st Qu.:17.40
##
                                                      1st Qu.:375.38
##
   Median : 5.000
                     Median :330.0
                                      Median :19.05
                                                      Median :391.44
##
   Mean
          : 9.549
                     Mean
                             :408.2
                                      Mean
                                             :18.46
                                                      Mean
                                                             :356.67
##
    3rd Qu.:24.000
                     3rd Qu.:666.0
                                      3rd Qu.:20.20
                                                      3rd Qu.:396.23
                                      Max.
                                                      Max.
##
   Max.
           :24.000
                     Max.
                             :711.0
                                             :22.00
                                                             :396.90
##
        1stat
                         medv
##
   Min.
         : 1.73
                    Min. : 5.00
    1st Qu.: 6.95
                    1st Qu.:17.02
##
##
   Median :11.36
                    Median :21.20
##
   Mean
           :12.65
                    Mean
                           :22.53
##
    3rd Qu.:16.95
                    3rd Qu.:25.00
           :37.97
                    Max.
                           :50.00
##
   Max.
Boston[1:2,]
        crim zn indus chas
                                     rm age
                                                dis rad tax ptratio black
                              nox
## 1 0.00632 18 2.31
                         0 0.538 6.575 65.2 4.0900 1 296
                                                               15.3 396.9
```

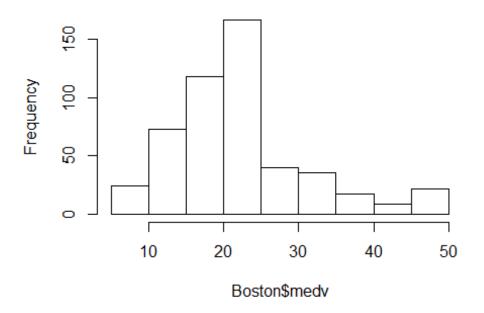
```
## 2 0.02731 0 7.07 0 0.469 6.421 78.9 4.9671 2 242 17.8 396.9
    1stat medv
## 1 4.98 24.0
## 2 9.14 21.6
#install.packages("GGally")
library("GGally")
## Warning: package 'GGally' was built under R version 3.5.2
## Loading required package: ggplot2
library("ggplot2")
lmbos<-lm(medv~.,data=Boston)</pre>
summary(lmbos)
##
## Call:
## lm(formula = medv ~ ., data = Boston)
## Residuals:
##
      Min
               10 Median
                               3Q
                                      Max
                   -0.518
                            1.777 26.199
## -15.595 -2.730
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) 3.646e+01 5.103e+00
                                    7.144 3.28e-12 ***
## crim
              -1.080e-01 3.286e-02 -3.287 0.001087 **
               4.642e-02 1.373e-02 3.382 0.000778 ***
## zn
## indus
               2.056e-02 6.150e-02 0.334 0.738288
               2.687e+00 8.616e-01 3.118 0.001925 **
## chas
              -1.777e+01 3.820e+00 -4.651 4.25e-06 ***
## nox
               3.810e+00 4.179e-01 9.116 < 2e-16 ***
## rm
               6.922e-04 1.321e-02 0.052 0.958229
## age
## dis
              -1.476e+00 1.995e-01 -7.398 6.01e-13 ***
               3.060e-01 6.635e-02 4.613 5.07e-06 ***
## rad
              -1.233e-02 3.760e-03 -3.280 0.001112 **
## tax
              -9.527e-01 1.308e-01 -7.283 1.31e-12 ***
## ptratio
               9.312e-03 2.686e-03 3.467 0.000573 ***
## black
              -5.248e-01 5.072e-02 -10.347 < 2e-16 ***
## lstat
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 4.745 on 492 degrees of freedom
## Multiple R-squared: 0.7406, Adjusted R-squared: 0.7338
## F-statistic: 108.1 on 13 and 492 DF, p-value: < 2.2e-16
step(lmbos,direction = "backward")
## Start: AIC=1589.64
## medv \sim crim + zn + indus + chas + nox + rm + age + dis + rad +
```

```
## tax + ptratio + black + lstat
##
##
            Df Sum of Sq
                          RSS
## - age
                    0.06 11079 1587.7
             1
## - indus
             1
                    2.52 11081 1587.8
                         11079 1589.6
## <none>
## - chas
             1
                  218.97 11298 1597.5
## - tax
             1
                  242.26 11321 1598.6
           1 243.22 11322 1598.6
## - crim
             1 257.49 11336 1599.3
## - zn
             1 270.63 11349 1599.8
## - black
## - rad
             1 479.15 11558 1609.1
## - nox
             1 487.16 11566 1609.4
## - ptratio 1 1194.23 12273 1639.4
## - dis
             1
                 1232.41 12311 1641.0
## - rm
             1
                 1871.32 12950 1666.6
## - lstat
             1
                 2410.84 13490 1687.3
##
## Step: AIC=1587.65
## medv \sim crim + zn + indus + chas + nox + rm + dis + rad + tax +
##
      ptratio + black + lstat
##
            Df Sum of Sq RSS AIC
## - indus
             1
                    2.52 11081 1585.8
## <none>
                         11079 1587.7
                  219.91 11299 1595.6
## - chas
             1
## - tax
             1 242.24 11321 1596.6
## - crim
             1 243.20 11322 1596.6
## - zn
             1 260.32 11339 1597.4
## - black 1 272.26 11351 1597.9
## - rad
             1 481.09 11560 1607.2
## - nox
             1 520.87 11600 1608.9
## - ptratio 1 1200.23 12279 1637.7
## - dis
             1
                 1352.26 12431 1643.9
                 1959.55 13038 1668.0
## - rm
             1
                 2718.88 13798 1696.7
## - lstat
             1
##
## Step: AIC=1585.76
## medv ~ crim + zn + chas + nox + rm + dis + rad + tax + ptratio +
##
      black + lstat
##
##
            Df Sum of Sa
                         RSS
                                 AIC
## <none>
                         11081 1585.8
## - chas
             1
                  227.21 11309 1594.0
                  245.37 11327 1594.8
## - crim
             1
## - zn
             1
                 257.82 11339 1595.4
## - black
             1
               270.82 11352 1596.0
## - tax
             1 273.62 11355 1596.1
             1 500.92 11582 1606.1
## - rad
        1 541.91 11623 1607.9
## - nox
```

```
## - ptratio 1
                  1206.45 12288 1636.0
## - dis
                  1448.94 12530 1645.9
              1
## - rm
              1
                  1963.66 13045 1666.3
## - 1stat
              1
                  2723.48 13805 1695.0
##
## Call:
## lm(formula = medv \sim crim + zn + chas + nox + rm + dis + rad +
       tax + ptratio + black + lstat, data = Boston)
##
## Coefficients:
## (Intercept)
                       crim
                                                  chas
                                      zn
                                                                nox
     36.341145
##
                  -0.108413
                                0.045845
                                              2.718716
                                                         -17.376023
##
            rm
                        dis
                                     rad
                                                  tax
                                                            ptratio
##
      3.801579
                  -1.492711
                                0.299608
                                             -0.011778
                                                          -0.946525
##
         black
                      lstat
##
      0.009291
                  -0.522553
step(lmbos, direction = "backward", k=log(506))
## Start: AIC=1648.81
## medv \sim crim + zn + indus + chas + nox + rm + age + dis + rad +
##
       tax + ptratio + black + lstat
##
##
             Df Sum of Sq
                            RSS
                     0.06 11079 1642.6
## - age
              1
## - indus
              1
                     2.52 11081 1642.7
## <none>
                          11079 1648.8
## - chas
              1
                   218.97 11298 1652.5
## - tax
              1
                   242.26 11321 1653.5
              1
                 243.22 11322 1653.6
## - crim
## - zn
                  257.49 11336 1654.2
              1
## - black
              1 270.63 11349 1654.8
## - rad
              1 479.15 11558 1664.0
## - nox
              1
                  487.16 11566 1664.4
## - ptratio 1 1194.23 12273 1694.4
## - dis
              1
                  1232.41 12311 1696.0
## - rm
              1
                  1871.32 12950 1721.6
## - lstat
              1
                  2410.84 13490 1742.2
##
## Step: AIC=1642.59
## medv \sim crim + zn + indus + chas + nox + rm + dis + rad + tax +
##
       ptratio + black + lstat
##
##
             Df Sum of Sq
                            RSS
## - indus
              1
                     2.52 11081 1636.5
## <none>
                          11079 1642.6
## - chas
              1
                   219.91 11299 1646.3
              1
                   242.24 11321 1647.3
## - tax
## - crim
              1 243.20 11322 1647.3
```

```
## - zn
              1
                   260.32 11339 1648.1
                   272.26 11351 1648.7
## - black
              1
## - rad
              1
                   481.09 11560 1657.9
## - nox
              1
                  520.87 11600 1659.6
## - ptratio
              1
                  1200.23 12279 1688.4
                  1352.26 12431 1694.6
## - dis
              1
## - rm
              1
                  1959.55 13038 1718.8
                  2718.88 13798 1747.4
## - lstat
              1
##
## Step: AIC=1636.48
## medv ~ crim + zn + chas + nox + rm + dis + rad + tax + ptratio +
       black + 1stat
##
##
##
             Df Sum of Sq
                            RSS
                                   AIC
## <none>
                          11081 1636.5
## - chas
              1
                   227.21 11309 1640.5
## - crim
              1
                   245.37 11327 1641.3
## - zn
              1
                   257.82 11339 1641.9
## - black
              1
                   270.82 11352 1642.5
## - tax
              1
                   273.62 11355 1642.6
## - rad
              1
                   500.92 11582 1652.6
## - nox
              1
                  541.91 11623 1654.4
## - ptratio 1 1206.45 12288 1682.5
## - dis
              1
                  1448.94 12530 1692.4
## - rm
                  1963.66 13045 1712.8
              1
## - 1stat
              1
                  2723.48 13805 1741.5
##
## Call:
## lm(formula = medv \sim crim + zn + chas + nox + rm + dis + rad +
##
       tax + ptratio + black + lstat, data = Boston)
##
## Coefficients:
## (Intercept)
                       crim
                                       zn
                                                  chas
                                                                nox
##
     36.341145
                  -0.108413
                                0.045845
                                              2.718716
                                                         -17.376023
##
                        dis
                                      rad
                                                            ptratio
                                                   tax
##
      3.801579
                  -1.492711
                                0.299608
                                             -0.011778
                                                          -0.946525
##
         black
                      lstat
##
      0.009291
                  -0.522553
#(a)the modelP-values< 2.2e-16, so from the P value, it was a good model.
#for the variables selected based on P-value<0.05,
#choose all the varible except"indus" and "age"
#AIC for regression model was 1589.64 ,BIC for it was 1648.81.
#Adj R sqaure was 0.7338
#(b)
hist(Boston$medv)
```

Histogram of Boston\$medv



```
#for the boston dataset, from the histogram, the medv variable was kind of ri
ght-skewness,
response_var<-log(Boston$medv)</pre>
lmbos2<-lm(response_var~crim+zn+indus+chas+nox+rm+age+dis+rad+tax+ptratio+bla</pre>
ck+lstat,data=Boston)
step(lmbos2,direction = "backward")
## Start: AIC=-1667.19
## response_var ~ crim + zn + indus + chas + nox + rm + age + dis +
       rad + tax + ptratio + black + lstat
##
##
##
             Df Sum of Sq
                              RSS
                                      AIC
              1
                   0.0057 17.755 -1669.0
## - age
## - indus
              1
                   0.0362 17.786 -1668.2
## <none>
                          17.749 -1667.2
## - zn
              1
                   0.1643 17.914 -1664.5
## - chas
              1
                   0.3088 18.058 -1660.5
## - black
              1
                   0.5339 18.283 -1654.2
## - tax
              1
                   0.6235 18.373 -1651.7
## - nox
              1
                   0.9351 18.684 -1643.2
## - rad
              1
                   1.0413 18.791 -1640.3
## - rm
              1
                   1.0637 18.813 -1639.7
## - dis
              1
                   1.3639 19.113 -1631.7
## - ptratio
             1
                   1.9270 19.676 -1617.0
              1
## - crim
                   2.1995 19.949 -1610.1
## - 1stat
              1
                   7.3809 25.130 -1493.2
```

```
##
## Step: AIC=-1669.03
## response_var ~ crim + zn + indus + chas + nox + rm + dis + rad +
       tax + ptratio + black + lstat
##
##
             Df Sum of Sq
                              RSS
                                      AIC
## - indus
                   0.0363 17.791 -1670.0
## <none>
                           17.755 -1669.0
## - zn
                   0.1593 17.914 -1666.5
              1
## - chas
              1
                   0.3138 18.069 -1662.2
## - black
              1
                   0.5431 18.298 -1655.8
                   0.6205 18.376 -1653.7
## - tax
              1
## - nox
              1
                   0.9645 18.720 -1644.3
## - rad
              1
                   1.0356 18.791 -1642.3
## - rm
              1
                   1.1452 18.900 -1639.4
## - dis
              1
                   1.5471 19.302 -1628.8
## - ptratio
              1
                   1.9224 19.677 -1619.0
## - crim
              1
                   2.1988 19.954 -1612.0
## - 1stat
              1
                   8.1949 25.950 -1479.0
##
## Step: AIC=-1670
## response_var ~ crim + zn + chas + nox + rm + dis + rad + tax +
##
       ptratio + black + 1stat
##
             Df Sum of Sq
##
                              RSS
                                      AIC
## <none>
                           17.791 -1670.0
                   0.1451 17.936 -1667.9
## - zn
              1
## - chas
                   0.3399 18.131 -1662.4
              1
## - black
              1
                   0.5344 18.326 -1657.0
## - tax
              1
                   0.6139 18.405 -1654.8
                   0.9350 18.726 -1646.1
## - nox
              1
## - rad
              1
                   1.0088 18.800 -1644.1
## - rm
              1
                   1.1171 18.909 -1641.2
## - dis
              1
                   1.7385 19.530 -1624.8
## - ptratio
              1
                   1.8862 19.678 -1621.0
## - crim
              1
                   2.2229 20.014 -1612.4
## - 1stat
                   8.1604 25.952 -1481.0
              1
##
## Call:
## lm(formula = response var ~ crim + zn + chas + nox + rm + dis +
       rad + tax + ptratio + black + lstat, data = Boston)
##
## Coefficients:
##
  (Intercept)
                        crim
                                                   chas
                                                                  nox
                                       zn
##
     4.0836823
                 -0.0103187
                                0.0010874
                                              0.1051484
                                                          -0.7217440
##
                         dis
                                                    tax
                                                             ptratio
            rm
                                      rad
##
     0.0906728
                  -0.0517059
                                0.0134457
                                             -0.0005579
                                                           -0.0374259
##
         black
                       lstat
##
                 -0.0286039
     0.0004127
```

```
step(lmbos2,direction = "backward",k=log(506))
## Start: AIC=-1608.02
## response_var ~ crim + zn + indus + chas + nox + rm + age + dis +
##
       rad + tax + ptratio + black + lstat
##
##
             Df Sum of Sq
                             RSS
                                      AIC
## - age
              1
                   0.0057 17.755 -1614.1
                   0.0362 17.786 -1613.2
## - indus
              1
## - zn
              1
                   0.1643 17.914 -1609.6
## <none>
                          17.749 -1608.0
## - chas
                   0.3088 18.058 -1605.5
              1
## - black
              1
                   0.5339 18.283 -1599.2
## - tax
              1
                   0.6235 18.373 -1596.8
## - nox
              1
                   0.9351 18.684 -1588.3
## - rad
              1
                   1.0413 18.791 -1585.4
## - rm
              1
                   1.0637 18.813 -1584.8
## - dis
              1
                   1.3639 19.113 -1576.8
## - ptratio 1
                   1.9270 19.676 -1562.1
## - crim
              1
                   2.1995 19.949 -1555.1
## - lstat
              1
                   7.3809 25.130 -1438.3
##
## Step: AIC=-1614.09
## response var \sim crim + zn + indus + chas + nox + rm + dis + rad +
##
       tax + ptratio + black + lstat
##
             Df Sum of Sq
##
                             RSS
                                      AIC
## - indus
              1
                   0.0363 17.791 -1619.3
## - zn
              1
                   0.1593 17.914 -1615.8
## <none>
                          17.755 -1614.1
## - chas
                   0.3138 18.069 -1611.5
              1
## - black
              1
                   0.5431 18.298 -1605.1
## - tax
              1
                   0.6205 18.376 -1602.9
## - nox
              1
                   0.9645 18.720 -1593.5
## - rad
              1
                   1.0356 18.791 -1591.6
## - rm
              1
                   1.1452 18.900 -1588.7
## - dis
              1
                   1.5471 19.302 -1578.0
                   1.9224 19.677 -1568.3
## - ptratio
              1
## - crim
              1
                   2.1988 19.954 -1561.2
## - 1stat
              1
                   8.1949 25.950 -1428.3
##
## Step: AIC=-1619.28
## response var \sim crim + zn + chas + nox + rm + dis + rad + tax +
##
       ptratio + black + lstat
##
##
             Df Sum of Sq
                             RSS
                                      AIC
                   0.1451 17.936 -1621.4
## - zn
              1
## <none>
                          17.791 -1619.3
## - chas
              1
                   0.3399 18.131 -1615.9
## - black
                   0.5344 18.326 -1610.5
              1
```

```
## - tax
              1
                   0.6139 18.405 -1608.3
## - nox
              1
                   0.9350 18.726 -1599.6
## - rad
              1
                   1.0088 18.800 -1597.6
## - rm
              1
                   1.1171 18.909 -1594.7
## - dis
              1
                   1.7385 19.530 -1578.3
## - ptratio 1
                   1.8862 19.678 -1574.5
## - crim
              1
                   2.2229 20.014 -1565.9
## - lstat
              1
                   8.1604 25.952 -1434.5
##
## Step: AIC=-1621.4
## response_var ~ crim + chas + nox + rm + dis + rad + tax + ptratio +
       black + 1stat
##
##
##
             Df Sum of Sq
                             RSS
                                      AIC
## <none>
                          17.936 -1621.4
## - chas
              1
                   0.3388 18.275 -1618.2
## - tax
              1
                   0.5229 18.459 -1613.1
## - black
              1
                   0.5386 18.475 -1612.7
## - rad
              1
                   0.9601 18.897 -1601.2
## - nox
              1
                   1.0250 18.961 -1599.5
## - rm
              1
                   1.2650 19.201 -1593.1
## - dis
              1
                   1.6967 19.633 -1581.9
## - crim
              1
                  2.1377 20.074 -1570.7
## - ptratio 1
                  2.5632 20.500 -1560.0
## - lstat
              1
                   8.1516 26.088 -1438.1
##
## Call:
## lm(formula = response var \sim crim + chas + nox + rm + dis + rad +
##
       tax + ptratio + black + lstat, data = Boston)
##
## Coefficients:
## (Intercept)
                       crim
                                     chas
                                                   nox
                                                                 rm
##
     4.1000969
                               0.1049848
                 -0.0100763
                                            -0.7515379
                                                          0.0954516
##
                                               ptratio
           dis
                                                              black
                        rad
                                      tax
##
   -0.0442395
                  0.0130841
                             -0.0005050
                                            -0.0409840
                                                          0.0004143
##
         lstat
    -0.0285881
##
summary(1mbos2)
##
## Call:
## lm(formula = response var ~ crim + zn + indus + chas + nox +
##
       rm + age + dis + rad + tax + ptratio + black + lstat, data = Boston)
##
## Residuals:
        Min
                  10
                       Median
                                    3Q
                                             Max
## -0.73361 -0.09747 -0.01657 0.09629 0.86435
##
```

```
## Coefficients:
##
             Estimate Std. Error t value Pr(>|t|)
## (Intercept) 4.1020423 0.2042726 20.081 < 2e-16 ***
          ## crim
           0.0011725 0.0005495 2.134 0.033349 *
## zn
## indus
           0.0024668 0.0024614 1.002 0.316755
## chas
           0.1008876  0.0344859  2.925  0.003598 **
          ## nox
## rm
           0.0002106 0.0005287 0.398 0.690567
## age
           ## dis
           ## rad
          ## tax
           ## ptratio
           0.0004136 0.0001075 3.847 0.000135 ***
## black
## lstat
           -0.0290355 0.0020299 -14.304 < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.1899 on 492 degrees of freedom
## Multiple R-squared: 0.7896, Adjusted R-squared: 0.7841
## F-statistic: 142.1 on 13 and 492 DF, p-value: < 2.2e-16
#so we use the log of the variable to do the regression
#As the result, the AIC and for regression were -1667 and -1608 respectively,
#adjusted R square was 0.7841
#so we can conclude that when we log our response variable, the regression re
sult was better
#because of the AIC AND BIC were both negative, and higher the R square resul
#for the variable we selected, based on p-value<0.05, the result would be sam
e that "age" and "indus"
#should be not selected.
```

Homework_1-Q2.R

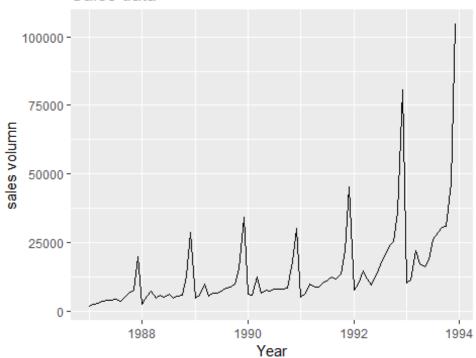
zeshi yang

Thu Feb 07 22:27:44 2019

```
#install.packages("fpp")
library(fpp)
## Warning: package 'fpp' was built under R version 3.5.2
## Loading required package: forecast
## Warning: package 'forecast' was built under R version 3.5.2
## Loading required package: fma
## Warning: package 'fma' was built under R version 3.5.2
## Loading required package: expsmooth
## Warning: package 'expsmooth' was built under R version 3.5.2
## Loading required package: lmtest
## Loading required package: zoo
##
## Attaching package: 'zoo'
## The following objects are masked from 'package:base':
##
##
       as.Date, as.Date.numeric
## Loading required package: tseries
## Warning: package 'tseries' was built under R version 3.5.2
library(tseries)
fancy
##
              Jan
                        Feb
                                                                 Jun
                                                                           Jul
                                  Mar
                                            Apr
                                                      May
## 1987
          1664.81
                    2397.53
                              2840.71
                                        3547.29
                                                   3752.96
                                                             3714.74
                                                                       4349.61
## 1988
          2499.81
                    5198.24
                              7225.14
                                        4806.03
                                                  5900.88
                                                             4951.34
                                                                       6179.12
## 1989
          4717.02
                    5702.63
                              9957.58
                                        5304.78
                                                   6492.43
                                                             6630.80
                                                                       7349.62
## 1990
          5921.10
                    5814.58 12421.25
                                        6369.77
                                                  7609.12
                                                             7224.75
                                                                       8121.22
## 1991
          4826.64
                                                            10209.48
                                                                      11276.55
                    6470.23
                              9638.77
                                        8821.17
                                                  8722.37
                             14558.40 11587.33
## 1992
          7615.03
                    9849.69
                                                  9332.56
                                                           13082.09
                                                                      16732.78
## 1993
         10243.24
                   11266.88
                             21826.84
                                       17357.33
                                                 15997.79
                                                           18601.53
                                                                      26155.15
##
                        Sep
                                  0ct
                                                      Dec
              Aug
                                            Nov
## 1987
          3566.34
                    5021.82
                              6423.48
                                        7600.60 19756.21
```

```
4752.15
## 1988
                   5496.43
                            5835.10 12600.08 28541.72
## 1989
         8176.62
                            9690.50 15151.84 34061.01
                   8573.17
## 1990
         7979.25
                            8476.70 17914.66 30114.41
                   8093.06
## 1991 12552.22 11637.39 13606.89 21822.11 45060.69
## 1992 19888.61 23933.38
                           25391.35 36024.80 80721.71
## 1993 28586.52 30505.41
                           30821.33 46634.38 104660.67
#(a) Produce a time plot of the data and describe the patterns
#in the graph. Identify any unusual or unexpected fluctuations in the time
series.
autoplot(fancy, xlab="Year", ylab="sales volumn", main="Sales data")
```

Sales data



#FROM the chare, it can be seen that a seasonal pattern that every March, it
will be a
#increase of sales, and the December always peak. the sales increaseWith the
time going on.

#(b) Use R function "tslm" to fit a regression model to the logarithms
#of these sales data with a linear trend and seasonal component.

#log of sales data
fancy_log <- log(fancy)

season_dummy <- rep(0, length(fancy))

Create seasonal Dummy Variable
season_dummy[seq_along(season_dummy)%%12 == 3] <- 1</pre>

```
#Skip first year March
season dummy[3] <- 0
#transfer seasonal dummy to time series data
season_dummy <- ts(season_dummy, frequency = 12, start = c(1987,1))</pre>
fancy_data <- data.frame(fancy_log, season_dummy)</pre>
#generate the time series model
tslm_fancy <- tslm(fancy_log~trend + season + season_dummy, data =
fancy_data)
summary(tslm fancy)#show the statistic results
##
## Call:
## tslm(formula = fancy_log ~ trend + season + season_dummy, data =
fancy data)
##
## Residuals:
##
       Min
                1Q
                     Median
                                 30
                                         Max
## -0.33673 -0.12757 0.00257 0.10911 0.37671
##
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 7.6196670 0.0742471 102.626 < 2e-16 ***
              0.0220198 0.0008268 26.634 < 2e-16 ***
## trend
              0.2514168 0.0956790
## season2
                                    2.628 0.010555 *
              0.2660828 0.1934044 1.376 0.173275
## season3
## season4
              0.4094870 0.0957325
## season5
                                    4.277 5.88e-05 ***
## season6
              0.4488283 0.0957647
                                    4.687 1.33e-05 ***
              0.6104545 0.0958039
## season7
                                    6.372 1.71e-08 ***
              0.5879644 0.0958503 6.134 4.53e-08 ***
## season8
              0.6693299 0.0959037 6.979 1.36e-09 ***
## season9
              ## season10
## season11
               1.2067479 0.0960319 12.566 < 2e-16 ***
              1.9622412 0.0961066 20.417 < 2e-16 ***
## season12
## season_dummy 0.5015151 0.1964273 2.553 0.012856 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.179 on 70 degrees of freedom
## Multiple R-squared: 0.9567, Adjusted R-squared: 0.9487
                119 on 13 and 70 DF, p-value: < 2.2e-16
## F-statistic:
#from the results, we can see that Multiple R-square was 0.9567,
#Adjusted R-squared was 0.9487
```

#(c) Use multiple regression with trend variable and seasonal dummy variables

```
to
#redo the regression as shown in the lecture example.
#Check to see that you obtain the same results as tslm.
#x1 is the trend
x1=1:length(fancy)
#x2-x12 are seasonal dummy variables
x2=rep(c(0,1,0,0,0,0,0,0,0,0,0,0,0),7)
x3=rep(c(0,0,1,0,0,0,0,0,0,0,0,0,0),7)
x4=rep(c(0,0,0,1,0,0,0,0,0,0,0,0,0),7)
x5=rep(c(0,0,0,0,1,0,0,0,0,0,0,0,0),7)
x6=rep(c(0,0,0,0,0,1,0,0,0,0,0,0,0),7)
x7=rep(c(0,0,0,0,0,0,1,0,0,0,0,0),7)
x8=rep(c(0,0,0,0,0,0,0,1,0,0,0,0),7)
x9=rep(c(0,0,0,0,0,0,0,0,1,0,0,0),7)
x10=rep(c(0,0,0,0,0,0,0,0,0,1,0,0),7)
x11=rep(c(0,0,0,0,0,0,0,0,0,0,1,0),7)
x12=rep(c(0,0,0,0,0,0,0,0,0,0,0,0,1),7)
#create the multiple regresion
fancy_lm<-lm(fancy_log~x1+x2+x3+x4+x5+x6+x7+x8+x9+x10+x11+x12)
#show the statistic results
summary(fancy lm)
##
## Call:
## lm(formula = fancy_log \sim x1 + x2 + x3 + x4 + x5 + x6 + x7 + x8 +
      x9 + x10 + x11 + x12
##
## Residuals:
        Min
                       Median
##
                  1Q
                                    3Q
                                            Max
## -0.41644 -0.12619 0.00608 0.11389
                                       0.38567
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) 7.6058604 0.0768740 98.939 < 2e-16 ***
## x1
              0.0223930 0.0008448 26.508 < 2e-16 ***
## x2
              0.2510437
                          0.0993278
                                    2.527 0.013718 *
              0.6952066 0.0993386
                                    6.998 1.18e-09 ***
## x3
              0.3829341
                                    3.854 0.000252 ***
## x4
                         0.0993565
              0.4079944 0.0993817
                                    4.105 0.000106 ***
## x5
## x6
              0.4469625 0.0994140
                                    4.496 2.63e-05 ***
## x7
              0.6082156 0.0994534 6.116 4.69e-08 ***
## x8
              0.5853524 0.0995001
                                    5.883 1.21e-07 ***
                                    6.693 4.27e-09 ***
## x9
              0.6663446 0.0995538
                                      7.469 1.61e-10 ***
## x10
              0.7440336
                          0.0996148
                          0.0996828 12.068 < 2e-16 ***
## x11
              1.2030164
## x12
              1.9581366 0.0997579 19.629 < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
```

```
## Residual standard error: 0.1858 on 71 degrees of freedom
## Multiple R-squared: 0.9527, Adjusted R-squared: 0.9447
## F-statistic: 119.1 on 12 and 71 DF, p-value: < 2.2e-16

#WE can see the Multiple R-squared: 0.9527, Adjusted R-squared: 0.9447
#which is almost the same result with the tslm regression.</pre>
```

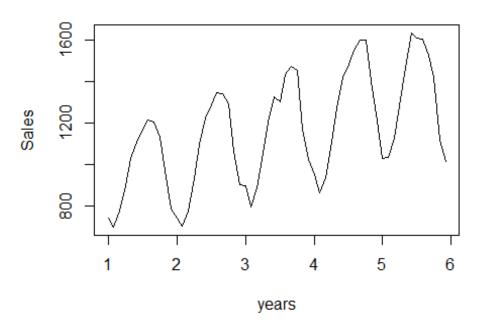
Homework_1-q3.R

zeshi yang

Thu Feb 07 23:39:44 2019

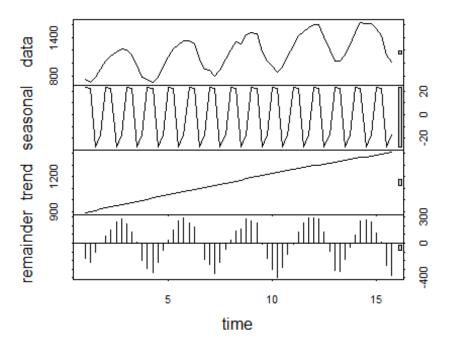
```
library(fpp)
## Warning: package 'fpp' was built under R version 3.5.2
## Loading required package: forecast
## Warning: package 'forecast' was built under R version 3.5.2
## Loading required package: fma
## Warning: package 'fma' was built under R version 3.5.2
## Loading required package: expsmooth
## Warning: package 'expsmooth' was built under R version 3.5.2
## Loading required package: lmtest
## Loading required package: zoo
##
## Attaching package: 'zoo'
## The following objects are masked from 'package:base':
##
      as.Date, as.Date.numeric
##
## Loading required package: tseries
## Warning: package 'tseries' was built under R version 3.5.2
library(tseries)
head(plastics)
##
      Jan Feb Mar Apr May Jun
## 1 742 697
               776 898 1030 1107
#(a) Plot the time series of sales of product A. Can you
#identify seasonal fluctuations or a trend?
plot(plastics,xlab="years",ylab="Sales", main="Sales of Product A")
```

Sales of Product A



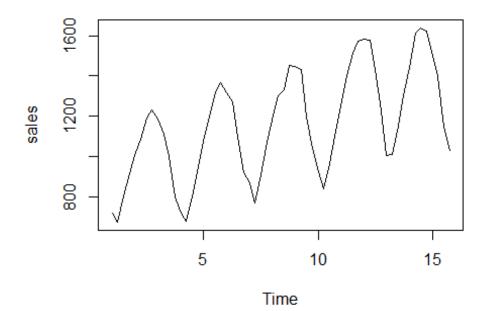
#(b) Perform a classical additive decomposition using "stl" function. Plot
out the decomposition for s.window="periodic", t.window=50.
ts_pl<-ts(plastics, frequency = 4)#requirement for additive decomponent
p_model<- stl(ts_pl, t.window=50, s.window="periodic")
plot(p_model,main = "classical additive decomposition")</pre>

classical additive decomposition



#(c) Compute and plot the seasonally adjusted data for s.window="periodic",
t.window=50.
plot(seasadj(p_model),ylab="sales",main="seasonal adjusted")

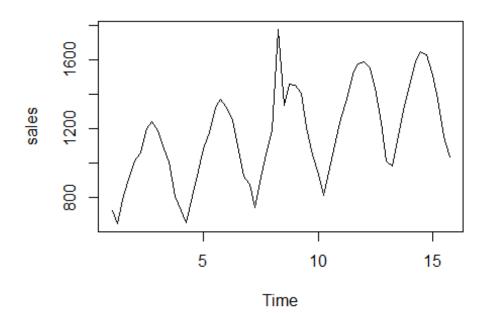
seasonal adjusted



```
#(d) Change one observation to be an outlier (pick one data point and add 500
to its value. For instance, if you picked July of the third year, the current
value is 1303, then the modified value will be 1803) and recompute the
seasonally adjusted data. What is the effect of the outlier. Again, you need
to do this for s.window="periodic", t.window=50.

plastic2 <- plastics
plastic2[30] = plastic2[30] + 500#choose the data point =30, which is the
middle.
#decompose again using additive decomposition
p_de2 <- ts(plastic2, frequency = 4)
p_model2<-stl(p_de2, t.window=50, s.window="periodic")
plot(seasadj(p_model2),ylab="sales",main="seasonal adjusted with outlier in
the middle")</pre>
```

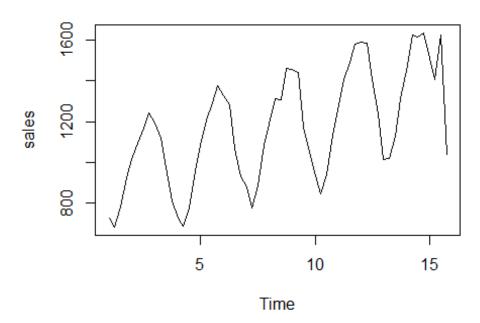
seasonal adjusted with outlier in the middle



#Does it make any difference if the outlier is near the end rather than in the middle of the time series? Try it out.

```
#to anwser this question, add outlier to the data point in the tail to see
how it affects
p3<- plastics
p3[59] = p3[59] + 500#choose the data point =59, which is the middle.
#decompose again using additive decomposition
p_de3 <- ts(p3, frequency = 4)
p_model3<-stl(p_de3, t.window=50, s.window="periodic")
plot(seasadj(p_model3),ylab="sales",main="seasonal adjusted with outlier in tail")</pre>
```

seasonal adjusted with outlier in tail



#Conclusion: there is difference if the outlier is near the end rather than in the middle of the time series, if there was an outlier increase in that month, so the adjusted seasonal chart observes a spike in that month.