Auto different data same (similar) model

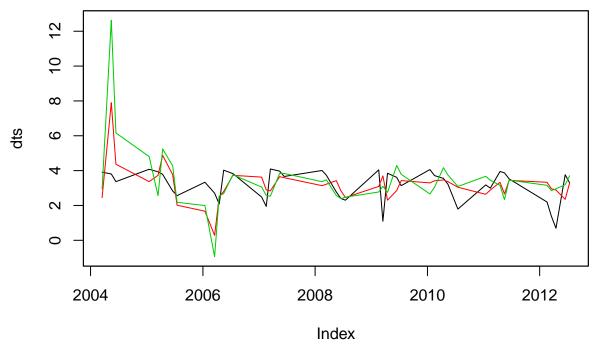
By Lily

replicate: same model, same data but without transforming Google Trend data

```
new merged <- read.csv("merged new.csv", header = TRUE)</pre>
#transform to numeric
#transform date format
new_merged <- transform(new_merged, sales=as.numeric(sales))</pre>
date<- as.Date(new_merged$date, format = "%y/%m/%d")</pre>
new_merged$date <- date</pre>
head(new_merged)
           date sales suv_index insurance_index
##
## 1 2003-02-14
                              65
## 2 2004-06-14
                   29
                                               70
                              62
## 3 2005-04-14 44
                              60
                                               69
## 4 2006-01-14 28
                              59
                                               72
## 5 2007-06-14 39
                              63
                                               70
## 6 2008-03-14
                  42
                              65
                                               73
new_merged$suv_ <- log(new_merged$suv_index/100)</pre>
new_merged$insurance_ <- log(new_merged$insurance_index/100)</pre>
#log sales
new_merged$sales <- log(new_merged$sales)</pre>
len <- length(new_merged$sales)</pre>
\#lag -1
t1 <- new_merged$sales[2:len]
#lag -12
t12 <- new_merged$sales[13:len]
#new merged with lag-1, lag-12
merged_with_lag <- new_merged[1: length(t12),]</pre>
merged_with_lag$lag_1 = t1[1: length(t12)]
merged_with_lag$lag_12 = t12[1:length(t12)]
#tail(new_merged,20)
#tail(merged_with_lag, 12)
reg0_new <- lm(sales~lag_1 + lag_12, data=merged_with_lag)</pre>
summary(reg0_new)
##
## lm(formula = sales ~ lag_1 + lag_12, data = merged_with_lag)
```

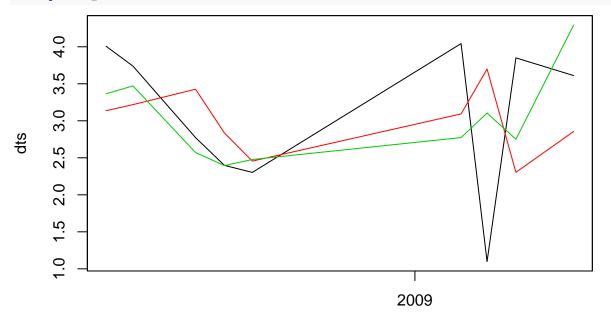
```
##
## Residuals:
      Min
              1Q Median
                             30
                                    Max
## -3.1852 -0.2290 0.2754 0.5737 1.0429
## Coefficients:
             Estimate Std. Error t value Pr(>|t|)
## (Intercept) 2.7526
                                 4.201 0.000124 ***
                         0.6553
## lag_1
               0.0346
                          0.1480 0.234 0.816216
                         0.1370 0.822 0.415480
## lag_12
               0.1126
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.9326 on 45 degrees of freedom
## Multiple R-squared: 0.01582,
                                Adjusted R-squared: -0.02793
## F-statistic: 0.3616 on 2 and 45 DF, p-value: 0.6986
reg1_new<- lm(sales~lag_1 + lag_12 + suv_index + insurance_index, data=merged_with_lag)
summary(reg1_new)
##
## Call:
## lm(formula = sales ~ lag_1 + lag_12 + suv_index + insurance_index,
      data = merged_with_lag)
## Residuals:
              1Q Median
      Min
                             3Q
                                    Max
## -2.9167 -0.4010 0.1072 0.5144 1.1968
##
## Coefficients:
                  Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                 -0.089251
                            0.150185 -0.594 0.555444
## lag_1
## lag_12
                 ## suv_index
                 -0.040079 0.031302 -1.280 0.207275
                            0.036792 0.384 0.702809
## insurance_index 0.014131
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.8919 on 43 degrees of freedom
## Multiple R-squared: 0.14, Adjusted R-squared: 0.05995
## F-statistic: 1.749 on 4 and 43 DF, p-value: 0.1568
library(here)
## here() starts at /Users/linatian/Desktop/msd final project/Sales
source("oosf.R")
## Loading required package: zoo
## Attaching package: 'zoo'
## The following objects are masked from 'package:base':
##
##
      as.Date, as.Date.numeric
```

```
merged_zoo <- zoo(new_merged[,-1], as.Date(new_merged[,1]))
y_new <- merged_zoo$sales
x_new <- merged_zoo[,c(2,3)]
z_new <- OutOfSampleForecast12(y_new,x_new,17)
# overall fit
MaeReport(z_new)</pre>
```



```
## mae.base mae.trends mae.delta
## 0.9266071 1.1261051 -0.2152994
```

MaeReport(z_new,"2007-12-01","2009-06-30")

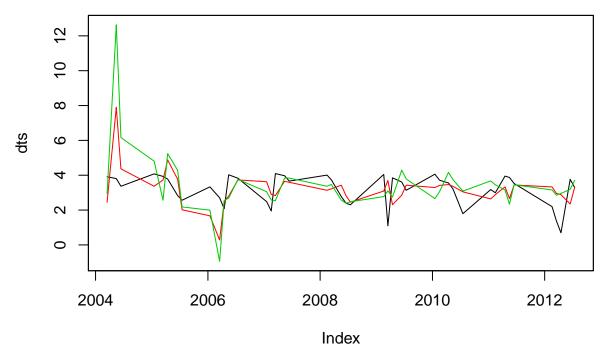


Index

```
## mae.base mae.trends mae.delta
## 0.9428646 0.7050709 0.2522035
```

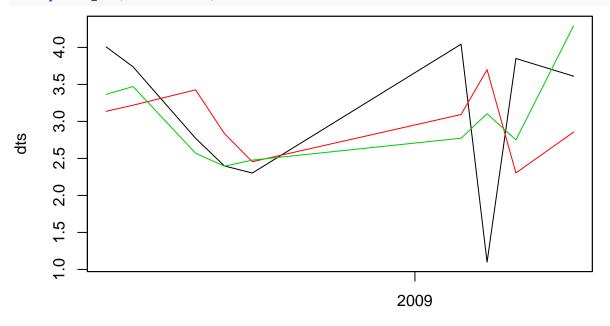
Transform Trend Data based on Jake's method

```
reg1_new<- lm(sales-lag_1 + lag_12 + suv_ + insurance_, data=merged_with_lag)
summary(reg1_new)
##
## Call:
## lm(formula = sales ~ lag_1 + lag_12 + suv_ + insurance_, data = merged_with_lag)
## Residuals:
##
      Min
               1Q Median
                               ЗQ
                                     Max
## -2.9132 -0.3983 0.1390 0.5321 1.2042
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 2.831382 0.711575 3.979 0.000261 ***
## lag_1
             0.002947 0.146102 0.020 0.984000
## lag 12
              -2.646104 2.231765 -1.186 0.242269
## suv
## insurance_ 0.840720 2.652086 0.317 0.752775
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.8959 on 43 degrees of freedom
## Multiple R-squared: 0.1321, Adjusted R-squared: 0.05142
## F-statistic: 1.637 on 4 and 43 DF, p-value: 0.1824
source("oosf.R")
merged_zoo <- zoo(new_merged[,-1], as.Date(new_merged[,1]))</pre>
y_new <- merged_zoo$sales</pre>
x_{new} \leftarrow merged_{zoo}[,c(2,3)]
z_new <- OutOfSampleForecast12(y_new,x_new,17)</pre>
# overall fit
MaeReport(z_new)
```



mae.base mae.trends mae.delta ## 0.9266071 1.1261051 -0.2152994

MaeReport(z_new,"2007-12-01","2009-06-30")



mae.base mae.trends mae.delta ## 0.9428646 0.7050709 0.2522035 Index

Paper's method

```
library(dyn)
dat <- read.csv("merged_paper.csv")</pre>
d <- zoo(dat[,-1],as.Date(dat[,1]))</pre>
y <- log(d$sales)
# baseline model
reg0 <- dyn ln(y - lag(y, -1) + lag(y, -12))
summary(reg0)
##
## Call:
## lm(formula = dyn(y \sim lag(y, -1) + lag(y, -12)))
## Residuals:
##
        Min
                    1Q
                          Median
                                        30
                                                 Max
## -0.209554 -0.034684 0.002482 0.040477 0.220976
##
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.67266
                       0.76355
                                   0.881 0.381117
                0.64345
                           0.07332
                                     8.776 3.59e-13 ***
## lag(y, -1)
## lag(y, -12) 0.29565
                           0.07282
                                    4.060 0.000118 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.07985 on 76 degrees of freedom
     (12 observations deleted due to missingness)
## Multiple R-squared: 0.7185, Adjusted R-squared: 0.7111
## F-statistic:
                  97 on 2 and 76 DF, p-value: < 2.2e-16
reg1 <- dyn \ln(y-lag(y,-1)+lag(y,-12)+suvs+insurance, data=dat)
summary(reg1)
##
## Call:
## lm(formula = dyn(y \sim lag(y, -1) + lag(y, -12) + suvs + insurance),
##
      data = dat)
##
## Residuals:
##
        Min
                    1Q
                          Median
                                        30
                                                 Max
## -0.161327 -0.043774 0.002998 0.036651 0.159219
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) -0.45798
                           0.78438 -0.584 0.561081
## lag(y, -1)
               0.61947
                           0.06318
                                   9.805 5.09e-15 ***
## lag(y, -12) 0.42865
                           0.06535
                                     6.559 6.45e-09 ***
                                     6.336 1.66e-08 ***
## suvs
               1.05721
                           0.16686
## insurance
             -0.52966
                           0.15206 -3.483 0.000835 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

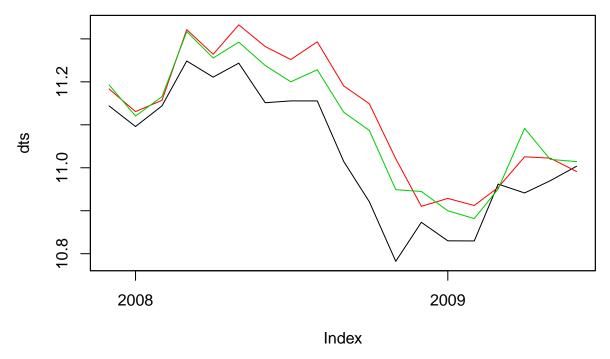
```
##
## Residual standard error: 0.06509 on 74 degrees of freedom
## (12 observations deleted due to missingness)
## Multiple R-squared: 0.8179, Adjusted R-squared: 0.808
## F-statistic: 83.08 on 4 and 74 DF, p-value: < 2.2e-16

y <- log(d$sales)
x <- d[,c(2,3)]
z <- OutOfSampleForecast12(y,x,17)
# overall fit
MaeReport(z)</pre>
```



mae.base mae.trends mae.delta ## 0.06343984 0.05667658 0.10660890

MaeReport(z,"2007-12-01","2009-06-30")



```
## mae.base mae.trends mae.delta
## 0.08869325 0.06965812 0.21461753
```

```
plot(z,plot.type="sin",col=c(1,1,"gray40"),lty=c(1,2,1),main="Motor Vehicles and Parts",ylab="log(mvp)"
legend("topright",c("actual","base","trends"),lty=c(1,2,1),col=c(1,1,"gray40"),lwd=c(1.5,1,1))
legend("bottomleft",c("MAE improvement","Overall = 10.5%","During recession = 21.5%"))
```

Motor Vehicles and Parts

