

bsts_problems

First error

The olldata parameter don't combine with olldata.timestamp parameter, and don't change enough the results.

Fit model

In this step just fit a bstst model that include Local linear trend and seasonal components.

The parameters have been adjusted as shown bellow.

Predictions

Visualization of the prediction output without applying the olldata parameter.

Error obtained when trying to include the olldata and olldata.timestamps parameters. Also, include de validation of that errors it is not real, number of observations and lenght of timestamp are equal.

```
pred_wolddata_ts <- try(predict(fit,
                                horizon = 100,
                                burn = burnin,
                                quantiles = c(.05, .95),
                                olldata = claims[50:80],
                                olldata.timestamps = index(claims[50:80]),
                                seed = 2408))

print(paste0("Difference between length of data and timestamp: ",length(index(claims[50:80])) - length(claims[50:80])))

## [1] "Difference between length of data and timestamp: 0"
```

```
pred_wolddata_ts

## [1] "Error : number.of.observations == length(timestamps) is not TRUE\n"
## attr(),"class")
## [1] "try-error"
## attr(),"condition")
## <simpleError: number.of.observations == length(timestamps) is not TRUE>
```

Second experiment, in this case removing timestamp, just olldata parameter has been defined using the 50:80 observations from training data.

```
pred_wolddata <- try(predict(fit,
                               horizon = 100,
                               burn = burnin,
                               quantiles = c(.05, .95),
                               olldata = claims[50:80],
                               seed = 2408))

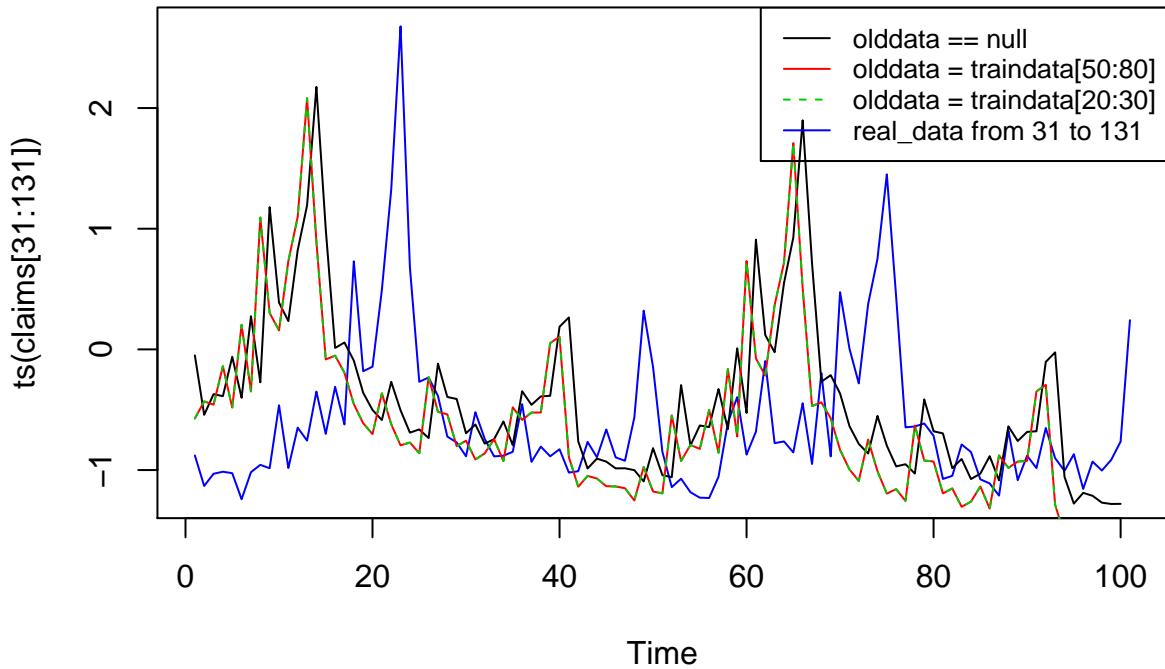
length(index(claims[50:80])) - length(claims[50:80])
```

```
## [1] 0
```

Third experiment, in this case removing timestamp, just olldata parameter has been defined using the 20:30 observations from training data.

It can be seen, that there are low difference between results using or not the olldata parameter. However, there are any difference between select differents samples of training data as olldata.

```
print(paste0("Acumulated difference between without olldata prediction and training[50:80] data:", sum(pred_wolddata[50:80]))  
## [1] "Acumulated difference between without olldata prediction and training[50:80] data:17.892251687210  
  
print(paste0("Acumulated difference between without olldata prediction and training[20:30] data:",sum(pred_wolddata[20:30]))  
## [1] "Acumulated difference between without olldata prediction and training[20:30] data:17.892251687210  
  
print(paste0("Acumulated difference between training[20:30] and training[50:80] data:",sum(pred_wolddata[50:80]-pred_wolddata[20:30]))  
## [1] "Acumulated difference between training[20:30] and training[50:80] data:0"  
  
plot(ts(claims[31:131]), col = 4)  
lines(ts(pred_woolddata$mean), col = 1)  
lines(ts(pred_wolddata$mean), col = 2)  
lines(ts(pred_wolddata2$mean), col = 3, lty = 2)  
  
legend("topright", legend=c("olldata == null", "olldata = traindata[50:80]", "olldata = traindata[20:30]"),  
       col=c(1,2,3,4), lty = c(1,1,2,1), cex=0.8)
```



Second problem

It is not possible combine newdata parameter for regression and add the olldata parameter to define the initial situation and values to generate a prediction.

When we combine olldata with new data to get a prediction, the function shows the next error:

Error: number.of.time.points > 0 is not TRUE In addition: Warning message: In is.na(observed.data\$response) : is.na() applied to non-(list or vector) of type 'NULL'

We have debugged the code and it seems like the predict function removes the response variable on the .FormatObservedDataForPredictions step. Looking into this function, the function .ExtractResponse doesn't get the response variable name from the formula parameter.

Fit with lags

After show some problems with the olldata parameter, let's explain the second issue.

We tried use newdata as a alternative to olldata adding some lags of the objective variable, that contain information from past. This alternative solve in some way the forecast problem for differents timestamps but return and error in combination with olldata parameter.

Train model

```
model_components <- list()
summary(model_components <- AddLocalLinearTrend(model_components,
                                                y = claims))
```

```

##      Length Class      Mode
## [1,]    6   LocalLinearTrend list

summary(model_components <- AddSeasonal(model_components,
                                         y = claims,
                                         nseasons = 52))

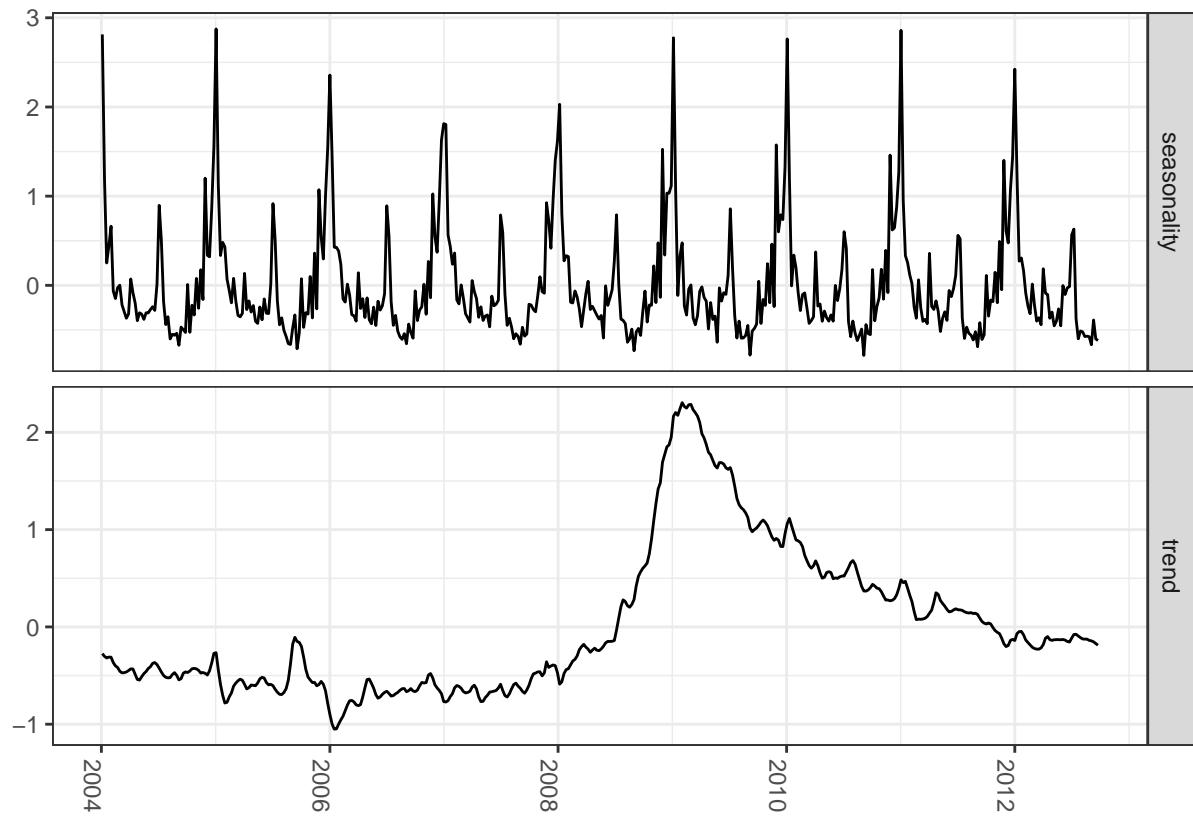
##      Length Class      Mode
## [1,]    6   LocalLinearTrend list
## [2,]    6   Seasonal      list

fit_reg <- bsts(data = claims_dt[1:400,],
                 formula = x ~.,
                 state.specification = model_components,
                 niter = 2000)

## ===== Iteration 0 Thu Mar 21 19:21:21 2019
## =====
## ===== Iteration 200 Thu Mar 21 19:21:27 2019
## =====
## ===== Iteration 400 Thu Mar 21 19:21:32 2019
## =====
## ===== Iteration 600 Thu Mar 21 19:21:38 2019
## =====
## ===== Iteration 800 Thu Mar 21 19:21:43 2019
## =====
## ===== Iteration 1000 Thu Mar 21 19:21:49 2019
## =====
## ===== Iteration 1200 Thu Mar 21 19:21:54 2019
## =====
## ===== Iteration 1400 Thu Mar 21 19:22:00 2019
## =====
## ===== Iteration 1600 Thu Mar 21 19:22:05 2019
## =====
## ===== Iteration 1800 Thu Mar 21 19:22:10 2019
## =====

burnin <- 500 # Throw away first 500
tibble(
  date = as.Date(time(claims)),
  trend = colMeans(fit$state.contributions[-(1:burnin),"trend",]),
  seasonality = colMeans(fit$state.contributions[-(1:burnin),"seasonal.52.1",])) %>%
gather("component", "value", trend, seasonality) %>%
ggplot(aes(x = date, y= value)) +
  geom_line() + theme_bw() +
  theme(legend.title = element_blank()) + ylab("") + xlab("") +
  facet_grid(component ~ ., scales="free") + guides(colour=FALSE) +
  theme(axis.text.x=element_text(angle = -90, hjust = 0))

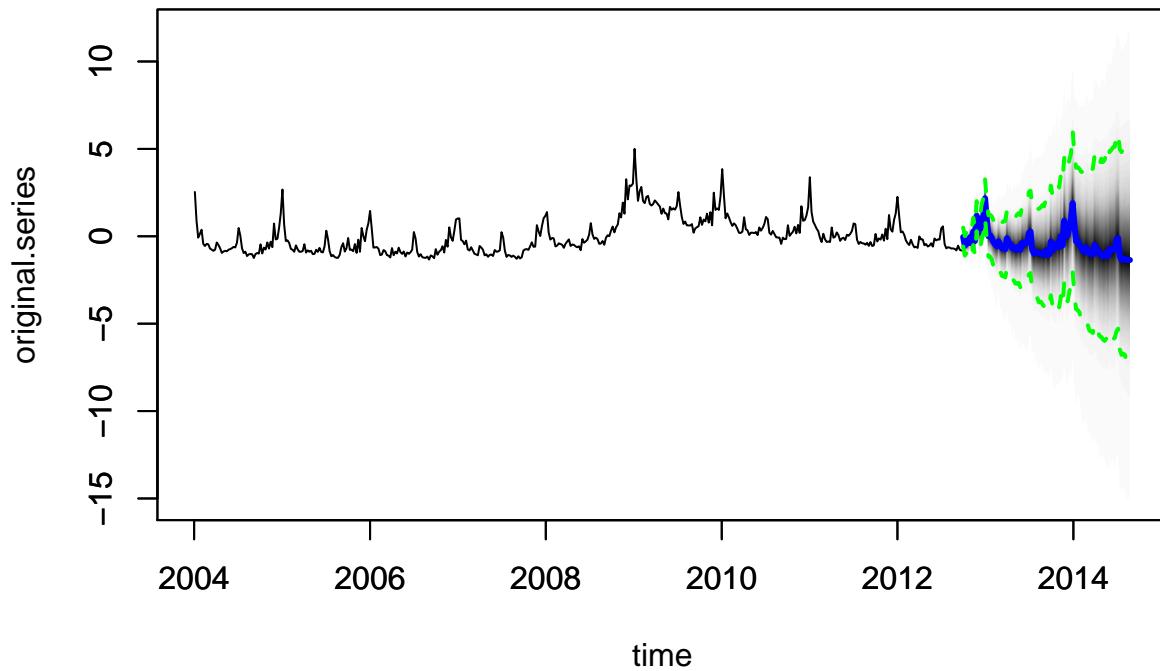
```



Predictions

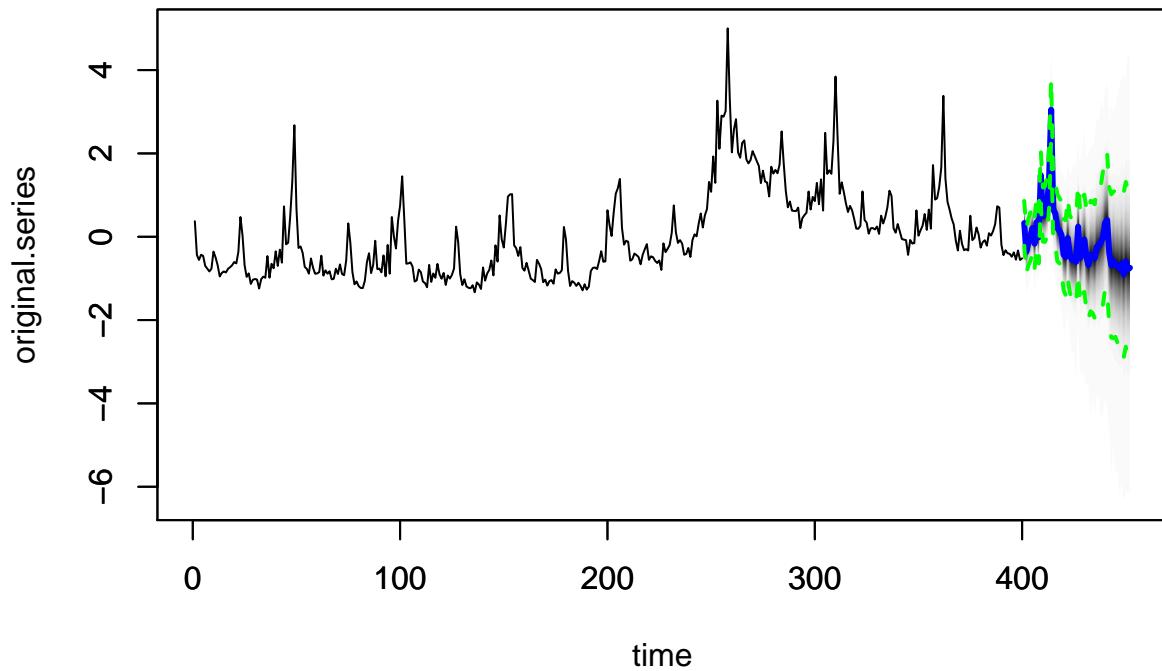
Visualization of the prediction output without applying the new model with lags and newdata.

```
pred_wo_newolddata <- predict(fit,
                                horizon = 100,
                                burn = burnin,
                                quantiles = c(.05, .95),
                                seed = 2408)
plot(pred_wo_newolddata)
```



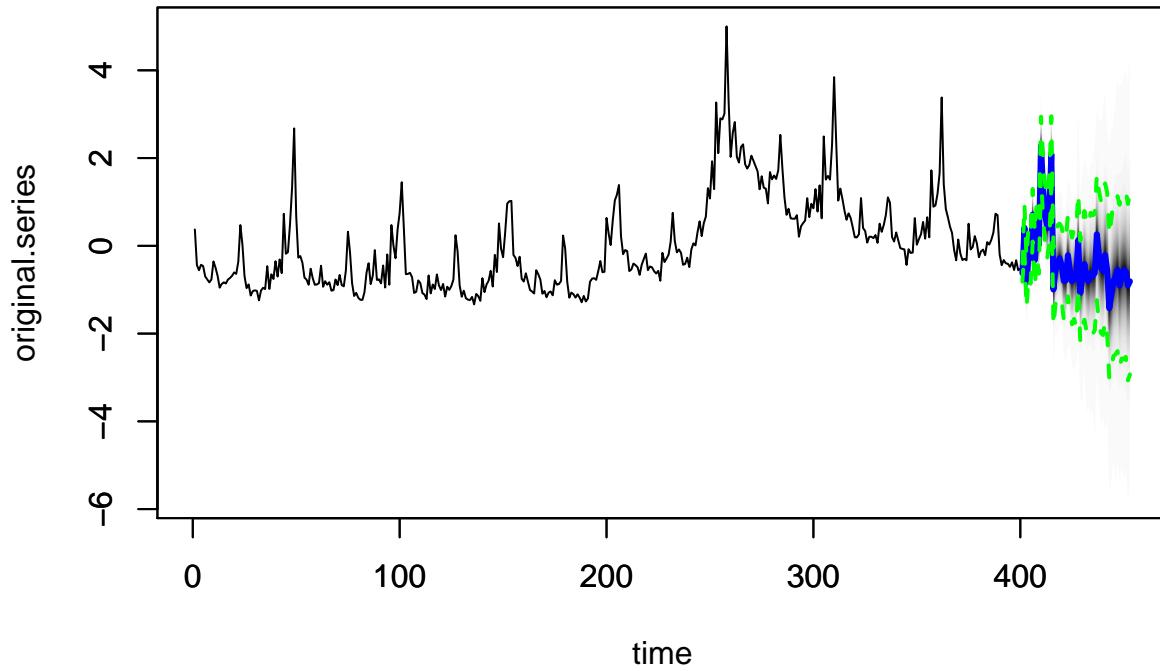
Second experiment, results of the second model using lags as regressors, so including newdata parameter between 401 and 452 timestamps, the end of the training data.

```
pred_wo_olddata <- try(predict(fit_reg,
                                horizon = 100,
                                burnin,
                                quantiles = c(.05, .95),
                                seed = 2408,
                                newdata = claims_dt[401:452],
                                timestamps = 401:452))
try(plot(pred_wo_olddata))
```



Third experiment, results of the second model using lags as regressors, so including newdata parameter between 40 and 92. We validate that modification of data it's not just stochastic approximation, data modifies prediction.

```
pred_wo_olddata2 <- try(predict(fit_reg,
  horizon = 100,
  burn = burnin,
  quantiles = c(.05, .95),
  seed = 2408,
  newdata = claims_dt[40:92],
  timestamps = 40:92))
try(plot(pred_wo_olddata2))
```



Error: Fourth experiment, results of the second model using lags as regressors, so including newdata parameter with data from training between 401 and 452, and olddata too. Same first error.

```

pred_w_newolddata_ts <- try(predict(fit,
                                      horizon = 100,
                                      burn = burnin,
                                      quantiles = c(.05, .95),
                                      olddata = claims_dt[50:80,],
                                      olddata.timestamps = index(claims_dt[50:80,]),
                                      newdata = claims_dt[401:452,!"x",with = F],
                                      timestamps = 401:452,
                                      seed = 2408))

pred_w_newolddata_ts

## [1] "Error : number.of.observations == length(timestamps) is not TRUE\n"
## attr(),"class")
## [1] "try-error"
## attr(),"condition")
## <simpleError: number.of.observations == length(timestamps) is not TRUE>

print(paste0("Difference of newdata length and newdata.timestamp length:",length(401:452) - length(claims_dt[401:452])))

## [1] "Difference of newdata length and newdata.timestamp length):0"

```

```

print(paste0("Difference of olldata length and olldata.timestamp length):", length(index(claims[50:80])))

## [1] "Difference of olldata length and olldata.timestamp length):0"

```

Error: Visualization of the prediction output applying the new model with lags and newdata, olldata without timestamp.

```

pred_w_newolldata <- try(predict(fit_reg,
                                   horizon = 100,
                                   burn = burnin,
                                   quantiles = c(.05, .95),
                                   olldata = claims_dt[20:30,],
                                   newdata = claims_dt[401:452, ! "x", with = F],
                                   timestamps = 401:452,
                                   seed = 2408))

```

```

## Warning in is.na(observed.data$response): is.na() aplicado a un objeto que
## no es (lista o vector) de tipo 'NULL'

```

```
pred_w_newolldata
```

```

## [1] "Error : number.of.time.points > 0 is not TRUE\n"
## attr(),"class")
## [1] "try-error"
## attr(),"condition")
## <simpleError: number.of.time.points > 0 is not TRUE>

```

We have debugged the code and it seems like the predict function removes the response variable on the .FormatObservedDataForPredictions step. Looking into this function, the function .ExtractResponse doesn't get the response variable name from the formula parameter.

```

## [1] "Acumulated difference between without olldata prediction and just newdata from 401 to 452:-11.61

## Warning in pred_wo_newolldata$mean[1:52] - pred_wo_olldata2$mean: longitud
## de objeto mayor no es múltiplo de la longitud de uno menor

## [1] "Acumulated difference between without olldata prediction and just newdata from 40 to 92:0.506956

## Warning in pred_wo_olldata$mean[1:52] - pred_wo_olldata2$mean: longitud de
## objeto mayor no es múltiplo de la longitud de uno menor

## [1] "Acumulated difference between newdata from 401 to 452 prediction and just newdata from 40 to 92:

plot(ts(pred_wo_newolldata$mean[1:52]), col = 1)
lines(ts(pred_wo_olldata$mean), col = 2, lty = 2)
lines(ts(pred_wo_olldata2$mean), col = 3)
lines(ts(claims_dt[401:452]$x), col = 4)
lines(ts(claims_dt[40:92]$x), col = 5)

legend("topright", legend=c("olldata = null, newdata = null", "olldata = NULL and newdata = traindata[40:92]", "olldata = traindata[40:92] and newdata = null", "olldata = traindata[40:92] and newdata = NULL", "olldata = NULL and newdata = traindata[40:92] and newdata = NULL"), col=c(1,2,3,4,5), lty = c(1,2,1,1,1), cex=0.8)

```

