

Robust time series analysis with R

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Wien, 20th September 2021

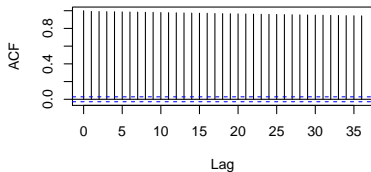
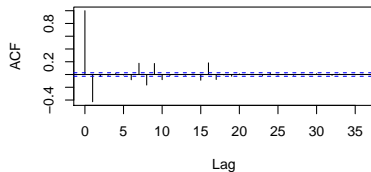
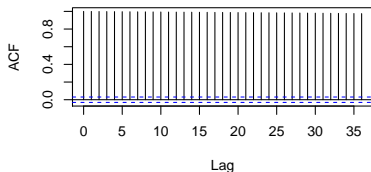
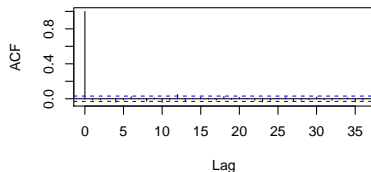


- 1 Calculate the ACF of the stock prices of SAP (SAP2.Rdata) robustly and by the empirical ACF. consider the raw prices and the log returns defined by $(\tilde{X}_t)_{t=2,\dots,n}$ defined by $\tilde{X}_t = \log(X_t) - \log(X_{t-1})$.
- 2 Determine the frequency of the guitar string (guitar2.Rdata)! (Which string is played and is it tuned correctly?)
- 3 Smooth the NO2 values robustly and non robustly. Decide for a reasonable period length (and specify it by the freq argument in the ts-object)

Note: install `robts` (after installing dependencies: `robustbase`, `rrcov`, `SpatialNP`, `ICSNP`, `sscor`, `quantreg`, `ltsa`) by:

```
install.packages("robts", repos="http://R-Forge.R-project.org")
```

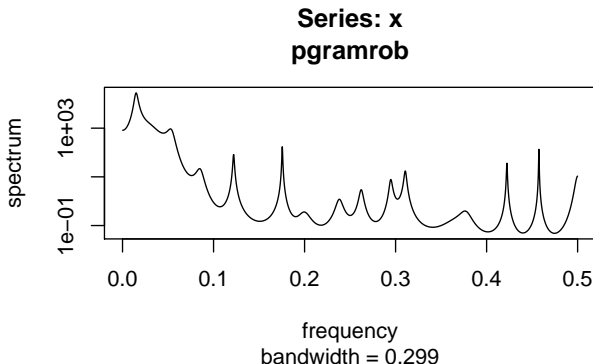
```
> load("SAP2.Rdata")  
> raw <- SAP[,2]  
> logreturn <- diff(log(SAP[,2]))  
> acf(raw)  
> acf(logreturn)  
> acfrob(raw)  
> acfrob(logreturn)
```

Empirical raw**Empirical log-return****Series raw****Series logreturn**

Empirical ACFs in the first row, robust ACFs in the second row

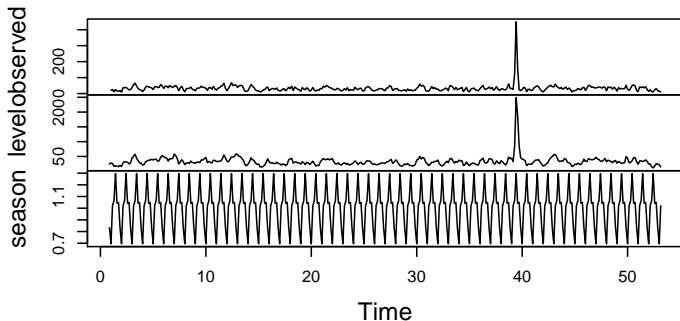
```
> spectrumg <- spectrumrob(guitar[,2])  
> index <- which.max(spectrumg$spec)  
> spectrumg$freq[index]*8000
```

the frequency is 119Hz which is a little to high for an Astring



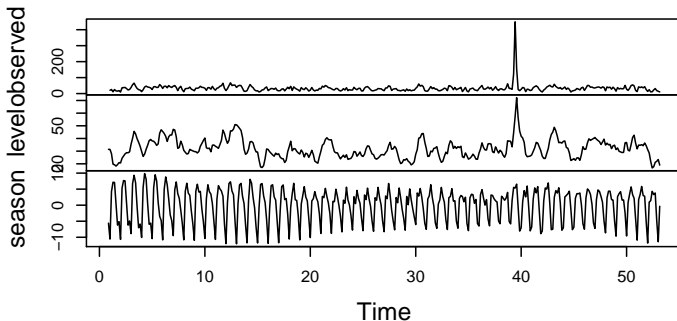
```
>load("NO2Krefeld.Rdata")  
>KrefeldNO2 <- ts(Krefeld[,2],freq=7)  
>etsresult <- ets(KrefeldNO2)  
>robetsresult <- robets(KrefeldNO2)  
>plot(etsresult)  
>plot(robetsresult)
```

Decomposition by ETS(M,N,M) method

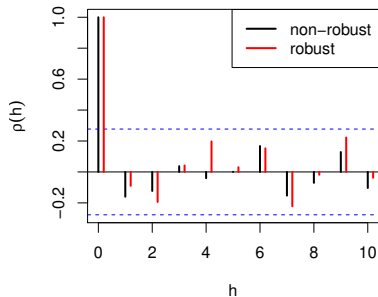
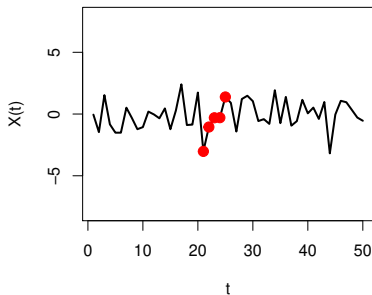


Non-robust smoothing

Decomposition by ROBETS(A,N,A) method



Robust smoothing



AR(1) with $\pi = 0.9$ and one outlier (left) and estimated ACF (right)

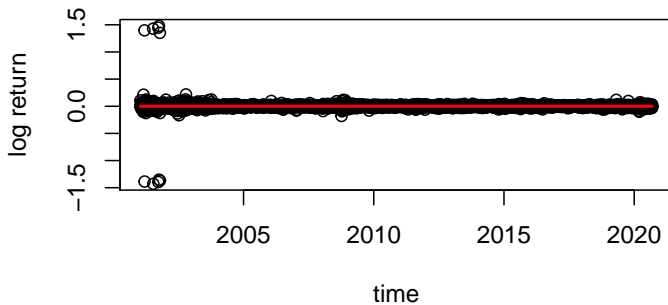
AR(1) with $\pi = 0.9$ and one outlier (left) and estimated ACF (right)

- 1 Detect changes in the location and scale of the log returns of the SAP stock prices. If you can detect a change (significance level 0.05), split the time series in two and try to detect changes there.
- 2 Fit an ARMA model to the yearly sunhours of Chemnitz robustly, try also conventional fits of order $(1,0)$, $(0,1)$ and $(1,1)$.

```
> logreturns <- diff(log(SAP[,2]))
> test1 <- huber_cusum(logreturns,fun="HLm")
> test1$p.value
> test1$cp.location
> test2a <- huber_cusum(logreturns[1:2008],fun="HLm")
> test2b <- huber_cusum(logreturns[2009:4984],fun="HLm")
> test2a$p.value
> test2b$p.value
> median(logreturns[1:2008]) - median(logreturns[2009:4984])
```

difference is around 0.001!

Log returns of SAP stock prices



Estimated location function

- 1 Try to predict the number of covid cases in Austria for the next days.

```

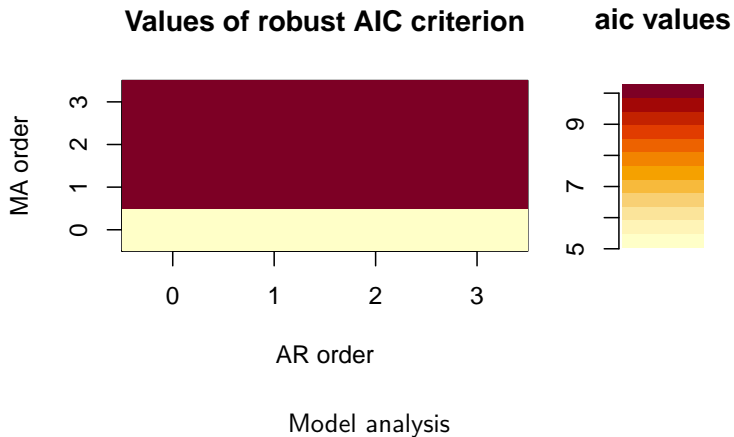
> armarobM <- armarob(sunhours[,2],arorder=3,maorder=3,
  aic=TRUE,aicpenalty=function(p) return(p*log(length(sunh
> arma10 <- arma(sunhours[,2],c(1,0))
> arma01 <- arma(sunhours[,2],c(0,1))
> arma11 <- arma(sunhours[,2],c(1,1))

```

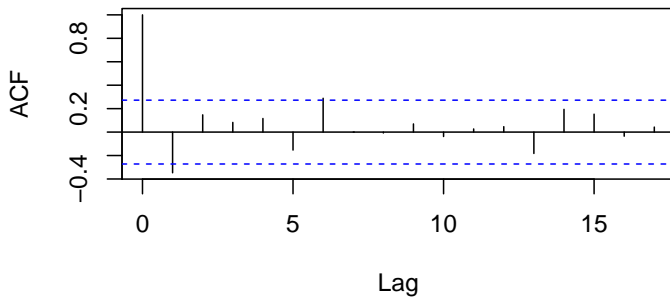
only robust ARMA model [AR(1)] and MA(1) are reasonable

model	μ	π	θ
robust	1603	0.51	0
non robust AR(1)	1197	0.26	
non robust ARMA(1,1)	1196	0.78	-0.58
non robust MA(1)	1611	0	0.23

Parameter estimations

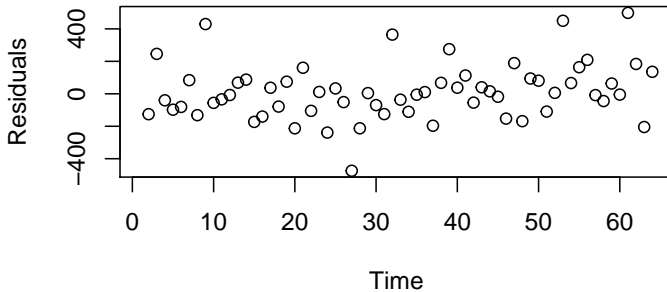


Robust ACF of the residuals



Model analysis

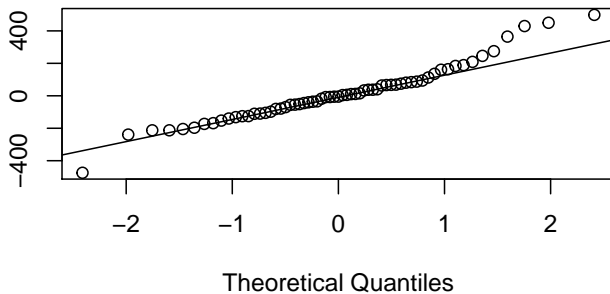
Residuals over time



Model analysis

Normal QQ plot of the residuals

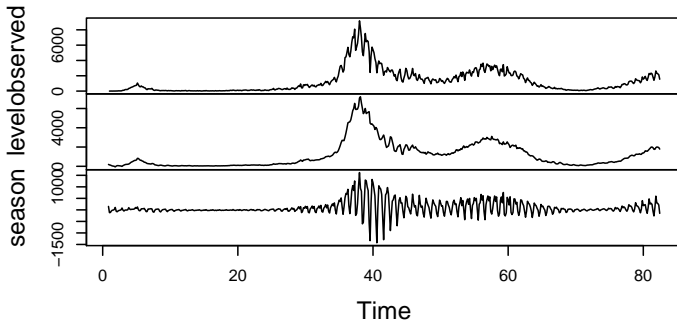
Normal Q-Q Plot



Model analysis

```
> load("Covid.Rdata")  
> covidtimes <- ts(Covid[,5],freq=7)  
> robModel <- robets(covidtimes)  
> predict(robModel)
```

Decomposition by ROBETS(A,N,A) method



Robustly smoothed covid data

- <https://open.data.dwd.de>
- <https://finance.yahoo.com>
- <https://covid19-dashboard.ages.at>
- <https://www.lanuv.nrw.de>