Pre-Processing O3 Data

```
library(zoo)

## Warning: package 'zoo' was built under R version 3.6.3

##

## Attaching package: 'zoo'

## The following objects are masked from 'package:base':

##

## as.Date, as.Date.numeric

library(stats)
```

Summary

```
## London Berlin Madrid Rome

## 2018-01-01 46.84612 57.41639 50.70971 26.781250

## 2018-01-02 33.60102 31.25111 42.76274 24.630208

## 2018-01-03 56.26416 47.44597 18.82032 8.119792

## 2018-01-04 42.79985 48.48153 20.97162 6.697917

## 2018-01-05 33.86294 43.12917 36.54381 9.507473

## 2018-01-06 15.74904 26.68944 53.63199 19.630208
```

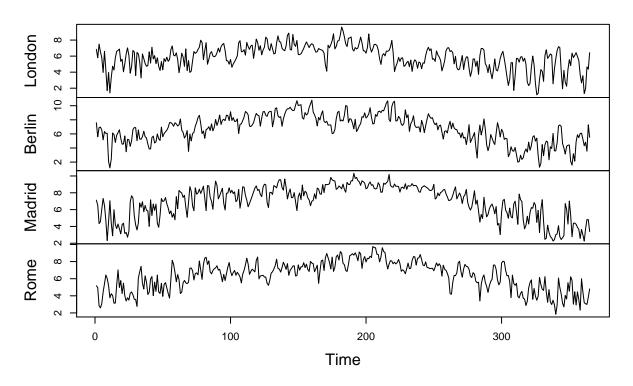
Common trends

Explain stylized facts from the literature.

Taking the square-root transform to buring the data back to the light tialed domain as suggested in Cho & Fryzlewicz (2021) and impututing any missing values by linear interpolation, the common trends from the litterature are somewhet apparent.

```
sample.cities <- sqrt(sample.cities)
for (city in names(sample.cities)) sample.cities[[city]] <- na.approx(sample.cities[[city]])
plot.ts(sample.cities, main = "03 concentration 2018")</pre>
```

O3 concentration 2018



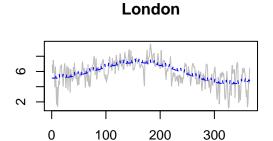
Removing trends

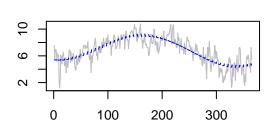
```
days <- as.Date(rownames(sample.cities), format = "%Y-%m-%d")
tt <- 1:length(days)

sat <- ifelse(weekdays(days) == "Saturday", 1, 0)
sun <- ifelse(weekdays(days) == "Sunday", 1, 0)

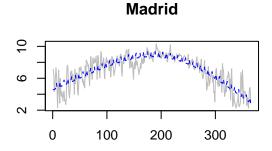
s.qt <- sin(2*pi*tt/365/4)
c.qt <- cos(2*pi*tt/365/4)
s.yr <- sin(2*pi*tt/365)
c.yr <- cos(2*pi*tt/365)
trend.models <- list()

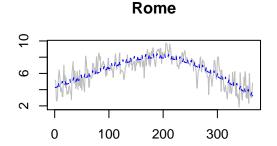
for (city in names(sample.cities)) trend.models[[city]] <- lm(
    sample.cities[[city]] ~ sat + sun + s.qt + c.qt + s.yr + c.yr
)</pre>
```





Berlin

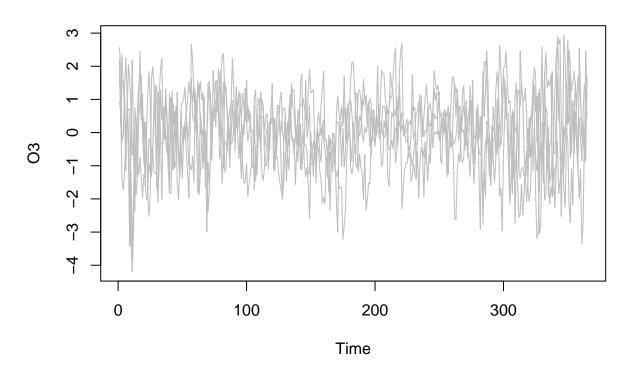




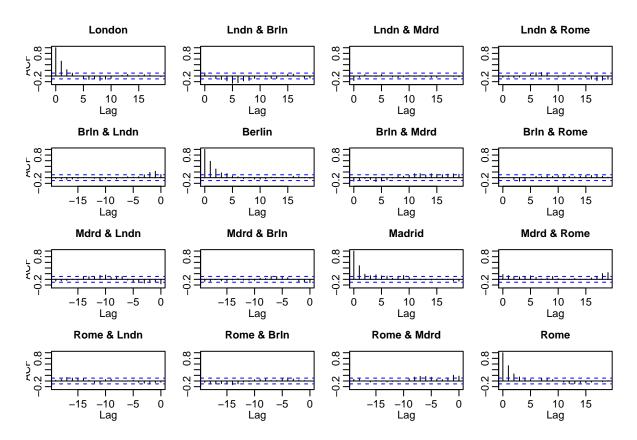
summary(trend.models[["London"]])

```
##
## Call:
## lm(formula = sample.cities[[city]] ~ sat + sun + s.qt + c.qt +
       s.yr + c.yr)
##
##
## Residuals:
##
       Min
                1Q Median
                                       Max
   -3.7132 -0.7451 0.0604 0.8147
                                    2.7578
##
## Coefficients:
                Estimate Std. Error t value Pr(>|t|)
##
                           2.358478
                                       4.036 6.65e-05 ***
## (Intercept) 9.518953
                                      0.014 0.988812
## sat
                0.002467
                           0.175784
## sun
                0.471242
                           0.175797
                                      2.681 0.007689 **
## s.qt
               -3.111678
                           1.863048
                                     -1.670 0.095752
               -2.736223
                           1.855142
                                     -1.475 0.141108
## c.qt
                0.535525
                           0.141757
                                       3.778 0.000185 ***
## s.yr
                                     -5.049 7.08e-07 ***
               -1.644984
                           0.325798
## c.yr
                   0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
##
## Residual standard error: 1.157 on 358 degrees of freedom
## Multiple R-squared: 0.4121, Adjusted R-squared: 0.4023
## F-statistic: 41.83 on 6 and 358 DF, p-value: < 2.2e-16
```

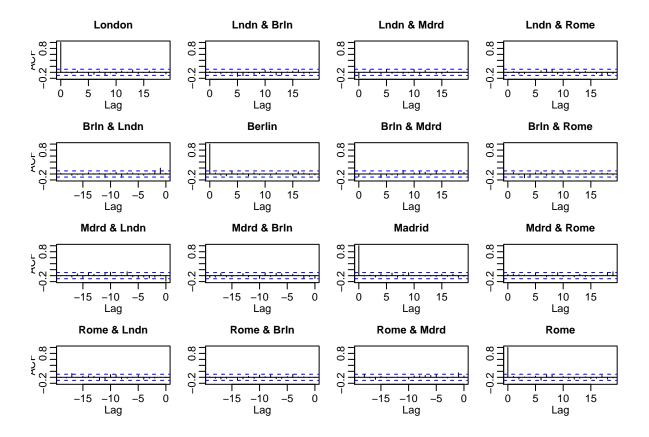
De-trended data



Removing serial correlation



```
ar.models <- list()
for (city in names(sample.cities)) ar.models[[city]] <- ar(detrended.data[[city]], order.max = 3)</pre>
```



Finally, the det-trended and whitened data is plotted below.

ts.plot(whitened.data, col = "grey", main = "Whitened and de-trended data", ylab = "03")

Whitened and de-trended data

