ENV 790.30 - Time Series Analysis for Energy Data | Spring 2023 Assignment 2 - Due date 02/03/23

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Submission Instructions

You should open the .rmd file corresponding to this assignment on RStudio. The file is available on our class repository on Github.

Once you have the file open on your local machine the first thing you will do is rename the file such that it includes your first and last name (e.g., "LuanaLima_TSA_A02_Sp23.Rmd"). Then change "Student Name" on line 4 with your name.

Then you will start working through the assignment by **creating code and output** that answer each question. Be sure to use this assignment document. Your report should contain the answer to each question and any plots/tables you obtained (when applicable).

When you have completed the assignment, **Knit** the text and code into a single PDF file. Submit this pdf using Sakai.

R packages

R packages needed for this assignment: "forecast", "tseries", and "dplyr". Install these packages, if you haven't done yet. Do not forget to load them before running your script, since they are NOT default packages.

```
#Load/install required package here
library(forecast)
## Registered S3 method overwritten by 'quantmod':
##
     method
                       from
     as.zoo.data.frame zoo
##
library(dplyr)
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
       intersect, setdiff, setequal, union
##
library(tseries)
```

Data set information

Consider the data provided in the spreadsheet "Table_10.1_Renewable_Energy_Production_and_Consumption_by_Source.x on our **Data** folder. The data comes from the US Energy Information and Administration and corresponds

to the December 2022 Monthly Energy Review. The spreadsheet is ready to be used. You will also find a .csv version of the data "Table_10.1_Renewable_Energy_Production_and_Consumption_by_Source-Edit.csv". You may use the function read.table() to import the .csv data in R. Or refer to the file "M2_ImportingData_CSV_XLSX.Rmd" in our Lessons folder for functions that are better suited for importing the .xlsx.

```
#Importing data set
energy_data <- read.csv(file="/Users/christine/Documents/TimeSeriesAnalysis/TimeSeriesAnalysis_Jiao/Data</pre>
```

Question 1

You will work only with the following columns: Total Biomass Energy Production, Total Renewable Energy Production, Hydroelectric Power Consumption. Create a data frame structure with these three time series only. Use the command head() to verify your data.

```
energy_data1 <- energy_data[,4:6]
head(energy_data1)</pre>
```

```
##
     Total.Biomass.Energy.Production Total.Renewable.Energy.Production
## 1
                               129.787
                                                                   403.981
## 2
                               117.338
                                                                   360.900
## 3
                               129.938
                                                                   400.161
## 4
                               125.636
                                                                   380.470
## 5
                                                                   392.141
                               129.834
## 6
                               125.611
                                                                   377.232
##
     Hydroelectric.Power.Consumption
## 1
                               272.703
## 2
                               242.199
## 3
                               268.810
## 4
                               253.185
## 5
                               260.770
## 6
                               249.859
```

Question 2

Transform your data frame in a time series object and specify the starting point and frequency of the time series using the function ts().

```
ts_energy_data1 <- ts(energy_data1, frequency=12, start=c(1973,1))
head(ts_energy_data1,20)</pre>
```

```
##
            Total.Biomass.Energy.Production Total.Renewable.Energy.Production
## Jan 1973
                                      129.787
                                                                          403.981
## Feb 1973
                                      117.338
                                                                          360.900
## Mar 1973
                                      129.938
                                                                          400.161
## Apr 1973
                                      125.636
                                                                          380.470
## May 1973
                                      129.834
                                                                          392.141
## Jun 1973
                                                                          377.232
                                      125.611
## Jul 1973
                                      129.787
                                                                          367.325
## Aug 1973
                                      129.918
                                                                          353.757
## Sep 1973
                                      125.782
                                                                          307.006
## Oct 1973
                                      129.970
                                                                          323.453
## Nov 1973
                                      125.643
                                                                          337.817
## Dec 1973
                                      129.824
                                                                          406.694
## Jan 1974
                                      130.807
                                                                          437.467
## Feb 1974
                                                                          399.942
                                      118.091
```

```
## Mar 1974
                                      130.727
                                                                         423.474
## Apr 1974
                                      126.583
                                                                         422.323
## May 1974
                                     130.789
                                                                         427.657
## Jun 1974
                                     126.611
                                                                         409.281
## Jul 1974
                                     130.756
                                                                         409.719
## Aug 1974
                                     130.763
                                                                         386.101
            Hydroelectric.Power.Consumption
##
## Jan 1973
                                     272.703
## Feb 1973
                                     242.199
                                     268.810
## Mar 1973
## Apr 1973
                                      253.185
## May 1973
                                     260.770
## Jun 1973
                                     249.859
## Jul 1973
                                     235.670
## Aug 1973
                                     222.077
## Sep 1973
                                     179.733
## Oct 1973
                                     191.723
## Nov 1973
                                     210.285
## Dec 1973
                                     274.435
## Jan 1974
                                     304.506
## Feb 1974
                                     279.950
## Mar 1974
                                     290.582
## Apr 1974
                                     293.702
## May 1974
                                     294.828
## Jun 1974
                                     280.695
## Jul 1974
                                     276.772
## Aug 1974
                                     253.175
```

Question 3

Compute mean and standard deviation for these three series.

```
Biomass_mean <- mean(ts_energy_data1[,"Total.Biomass.Energy.Production"])
Biomass_mean

## [1] 277.2525

Biomass_sd <- sd(ts_energy_data1[,"Total.Biomass.Energy.Production"])
Biomass_sd

## [1] 91.75367

Reweable_mean <- mean(ts_energy_data1[,"Total.Renewable.Energy.Production"])
Reweable_mean

## [1] 592.1583

Reweable_sd <- sd(ts_energy_data1[,"Total.Renewable.Energy.Production"])
Reweable_sd

## [1] 191.7978

Hydroelectric_mean <- mean(ts_energy_data1[,"Hydroelectric.Power.Consumption"])
Hydroelectric_mean
```

```
Hydroelectric_sd <- sd(ts_energy_data1[,"Hydroelectric.Power.Consumption"])
Hydroelectric_sd</pre>
```

```
## [1] 44.16116
```

The mean and the standard deviation of the Total.Biomass.Energy.Production is 277.2525226 and 91.7536727, respectively. The mean and the standard deviation of the Total.Renewable.Energy.Production is 592.1582948 and 191.7978345, respectively. The mean and the standard deviation of the Hydroelectric.Power.Consumption is 235.1146499 and 44.161163, respectively.

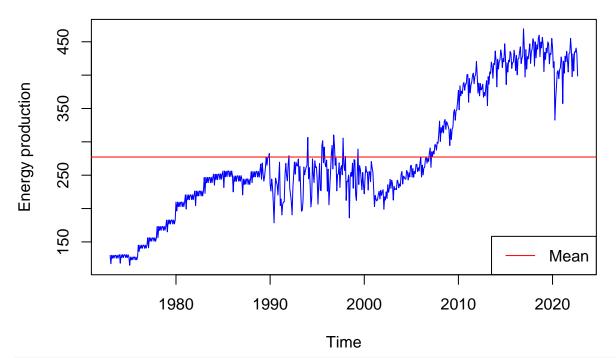
Question 4

Display and interpret the time series plot for each of these variables. Try to make your plot as informative as possible by writing titles, labels, etc. For each plot add a horizontal line at the mean of each series in a different color.

```
library(lubridate)
```

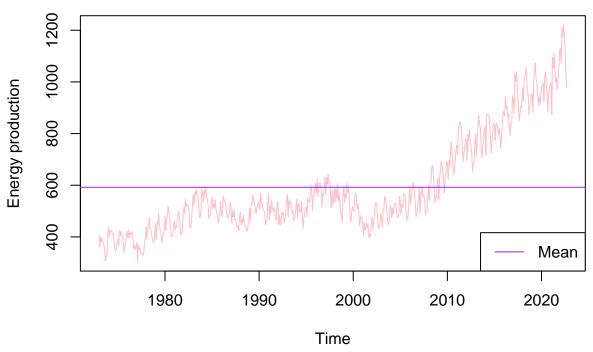
```
##
## Attaching package: 'lubridate'
## The following objects are masked from 'package:base':
##
## date, intersect, setdiff, union
plot(ts_energy_data1[,"Total.Biomass.Energy.Production"],type="l",col="blue",ylab="Energy production",m
abline(h=mean(ts_energy_data1[,"Total.Biomass.Energy.Production"]),col="red")
legend("bottomright", legend="Mean",col=c("red"), lty=1)
```

Biomass Energy data



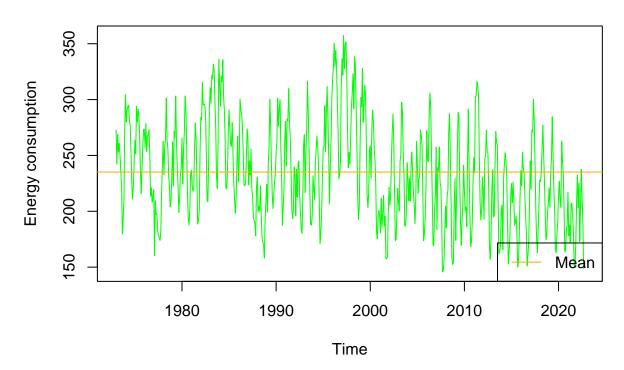
plot(ts_energy_data1[,"Total.Renewable.Energy.Production"],type="l",col="pink",ylab="Energy production"
abline(h=mean(ts_energy_data1[,"Total.Renewable.Energy.Production"]),col="purple")
legend("bottomright", legend="Mean",col=c("purple"), lty=1)

Renewable Energy data



plot(ts_energy_data1[,"Hydroelectric.Power.Consumption"],type="l",col="green",ylab="Energy
abline(h=mean(ts_energy_data1[,"Hydroelectric.Power.Consumption"]),col="orange")
legend("bottomright", legend="Mean",col=c("orange"), lty=1)

Hydroelectric Energy data



Question 5

Compute the correlation between these three series. Are they significantly correlated? Explain your answer.

```
corr <- cor(ts_energy_data1, use = "everything", method = c("spearman"))
corr

##
Total.Biomass.Energy.Production</pre>
```

```
Total.Biomass.Energy.Production
## Total.Biomass.Energy.Production
                                                            1.0000000
## Total.Renewable.Energy.Production
                                                            0.8868431
## Hydroelectric.Power.Consumption
                                                           -0.2902982
##
                                     Total.Renewable.Energy.Production
## Total.Biomass.Energy.Production
                                                             0.88684308
## Total.Renewable.Energy.Production
                                                             1.0000000
## Hydroelectric.Power.Consumption
                                                             0.05020665
##
                                     Hydroelectric.Power.Consumption
## Total.Biomass.Energy.Production
                                                          -0.29029824
## Total.Renewable.Energy.Production
                                                           0.05020665
## Hydroelectric.Power.Consumption
                                                           1.00000000
```

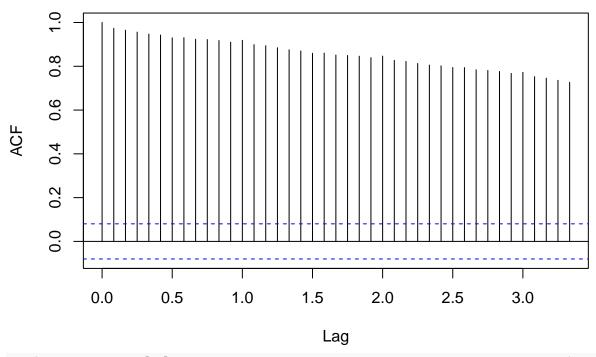
Since the data relationship is not linear, so use the Spearman's correlation instead of Pearson. The range of correlation is between +1 to -1. Closer to +1 means a stronger positive correlation. Closer to -1 means a stronger negative correlation. When the correlation is closer to 0, it means there is no trend. In this question, Total. Biomass. Energy. Production has a strong positive correlation with Total. Renewable. Energy. Production because the value is 0.8868431. Total. Renewable. Energy. Production has a strong negative correlation with Hydroelectric. Power. Consumption because the value is 0.0502066. Hydroelectric. Power. Consumption has a weak negative correlation with Total. Biomass. Energy. Production because the value is -0.2902982.

Question 6

Compute the autocorrelation function from lag 1 up to lag 40 for these three variables. What can you say about these plots? Do the three of them have the same behavior?

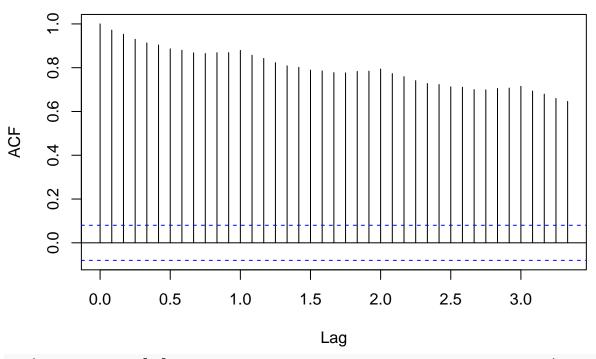
```
acf(ts_energy_data1[,1],lag.max = 40, main = "Total.Biomass.Energy.Production")
```

Total.Biomass.Energy.Production



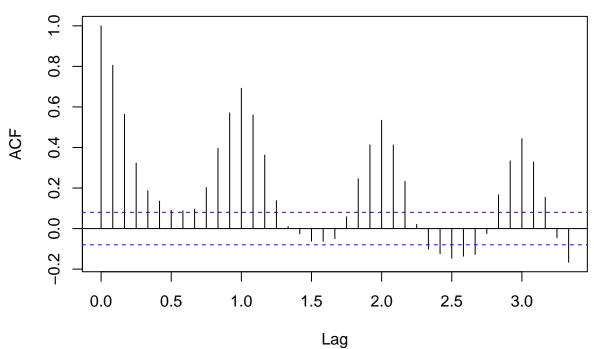
acf(ts_energy_data1[,2],lag.max = 40, main = "Total.Renewable.Energy.Production")

Total.Renewable.Energy.Production



acf(ts_energy_data1[,3],lag.max = 40, main = "Hydroelectric.Power.Consumption")

Hydroelectric.Power.Consumption



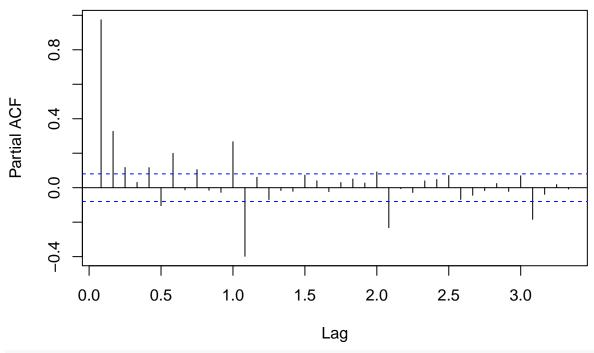
In the first pot, for lags up to 3.4, values are statistically significant. This represents that two adjacent values of the Total. Biomass. Energy. Production are highly correlated. In the second plot, for lags up to 3.4, values are statistically significant This represents that two adjacent values of the Total. Renewable. Energy. Production are highly correlated. In the third plot, the autocorrelation plot for Hydroelectric. Power. Consumption shows that the most spikes are outside the dotted line area, which means they are statistically significant. However, there are some spikes inside the dotted line area, which means they are not statistically significant. This represents most of the two adjacent values of that the Hydroelectric. Power. Consumption are highly correlated, but some are not.

Question 7

Compute the partial autocorrelation function from lag 1 to lag 40 for these three variables. How these plots differ from the ones in $\mathbb{Q}6$?

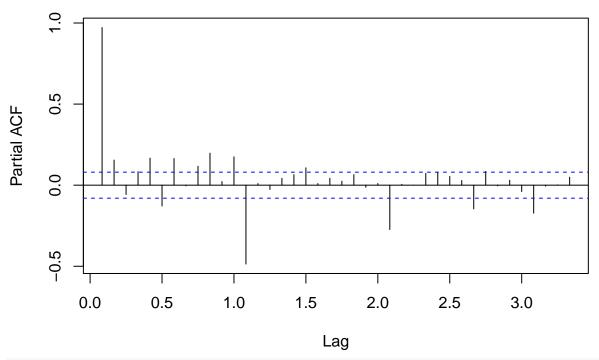
pacf(ts_energy_data1[,1],lag.max = 40)

Series ts_energy_data1[, 1]



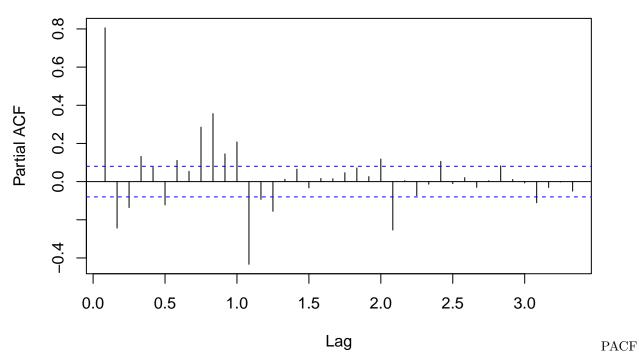
pacf(ts_energy_data1[,2],lag.max = 40)

Series ts_energy_data1[, 2]



pacf(ts_energy_data1[,3],lag.max = 40)

Series ts_energy_data1[, 3]



correlation is always smaller than ACF. PACF is about the directly correlation by removing all intermediate variables. Same with the ACF in Question6, spikes outside the dotted line area are statistically significant. Spikes inside the dotted line area are not statistically significant. Otherwise, ACF and PACF have similar ways for deciding correlations.