#### **TIME SERIES ANALYSIS**

**Author:** Bharat Thakur

### **Background**

Time series is a sequence of discrete-time data (Wikimedia Foundation, 2020). Time series is useful to analyze how a given variable changes over time. Now, we will perform time series analysis of temperature and precipitation data of two cities.

#### **Data Source**

There are two datasets used in this analysis:

- 1.) Average temperature by month of Welland from January 1985 to December 1994.
- 2.) Total precipitation in Waterloo for the years 1970 to 1995.

This report is divided into two main sections, section 1 and section 2. In section 1 we analyze Welland's temperature data and in section 2 we analyze Waterloo's rainfall data.

### **Section 1: Welland Temperature**

### 1. Data Transformation and Cleaning (Description)

#### **Dates**

The dates column was removed since we only need temperature data to perform time series analysis.

#### **Temperature**

The monthly temperature data was converted to time series data using function ts().

Jan	Feb	Mar	Apr	May	Jun
1985 -6.616129	-4.328571	1.367742	8.926667	14.151613	16.450000

### 2. Descriptive Data Analysis

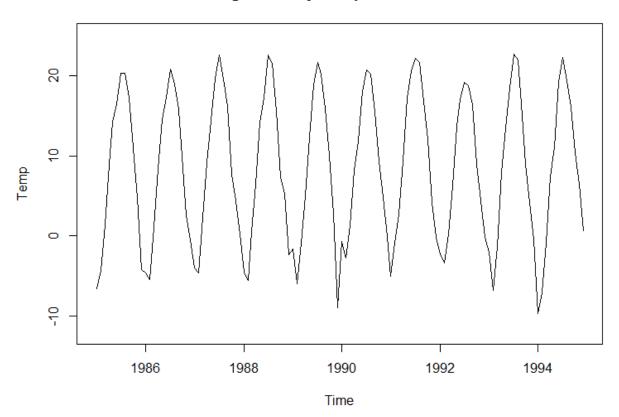
### 2.1 Summary of the temperature information:

	Temp
nbr.val	120.0000000
nbr.null	0.0000000
nbr.na	0.0000000
min	-9.7129032
max	22.6387097
range	32.3516129
sum	1015.5660173
median	8.9326882
mean	8.4630501

SE.mean	0.8500028
CI.mean.0.95	1.6830905
var	86.7005765
std.dev	9.3113144
coef.var	1.1002315

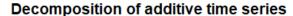
### 2.2 Plot of time series:

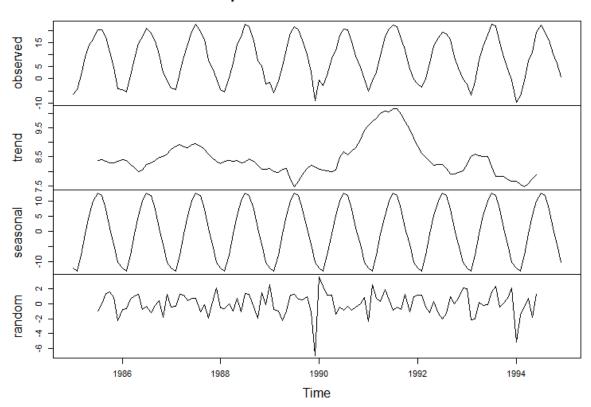
# Average Monthly Temperature - Welland



Temperature data shows strong seasonal tendencies although the mean temperature appears to be relatively constant.

#### 2.3 Decomposition of the times series data into the constituent components:





As we noted earlier, the trend is relatively constant except for a peak around 1992.

#### 2.4 Stationarity:

```
Warning in adf.test(TempStudy_BT): p-value smaller than printed p-value

Augmented Dickey-Fuller Test

data: TempStudy_BT

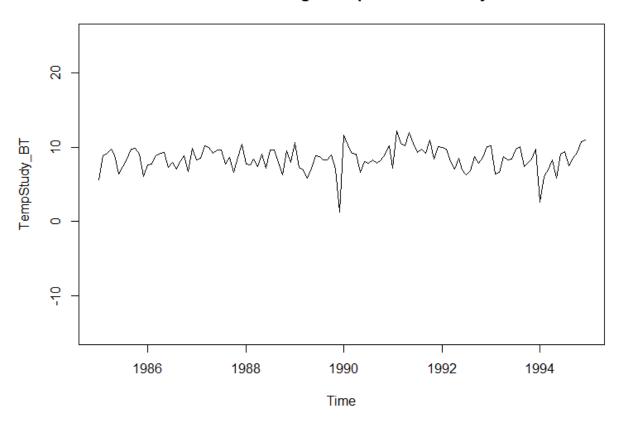
Dickey-Fuller = -13.342, Lag order = 4, p-value = 0.01

alternative hypothesis: stationary
```

Augmented Dickey-Fuller test resulted in a p-value less than .05 indicating that the time series is stationary.

## 2.5 Deseasonalized Temperature Data:

# Deseasonalized - Average Temperature Monthly - Welland



#### 2.6 Comments:

- 1. Overall trend component is not varying much, except for a peak around 1992.
- 2. As one would expect seasonal component has a strong cyclic nature.
- 3. The random component seems to have constant variance.

### **Section 2: Waterloo Precipitation**

### 1. Data Transformation and Cleaning (Description)

#### **Dates**

The dates column was removed since we only need precipitation data to perform time series analysis.

#### **Precipitation**

The total precipitation data was converted to time series data using function ts().

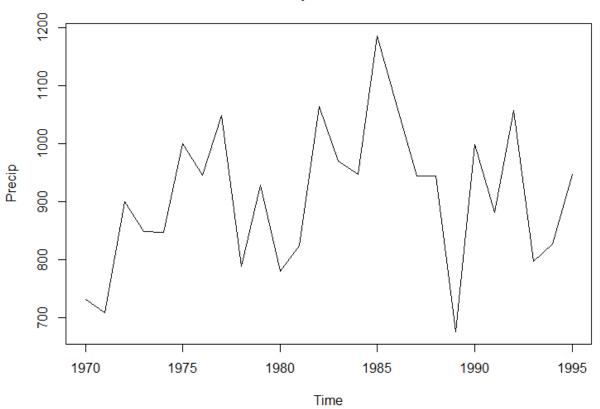
### 2. Descriptive Data Analysis

#### 2.1 Summary of the precipitation information:

```
Precip
nbr.val
                26.00000
nbr.null
                 0.00000
nbr.na
                 0.00000
min
               674.80000
max
              1186.40000
               511.60000
range
             23648.20000
sum
median
               936.10000
               909.54615
mean
SE.mean
                24.39122
CI.mean.0.95
                50.23467
             15468.22738
var
               124.37133
std.dev
coef.var
                 0.13674
```

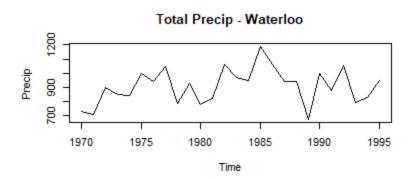
# 2.2 Plot of time series:

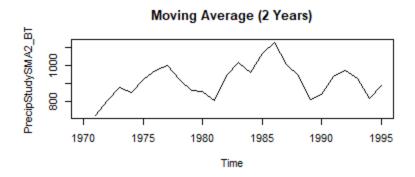


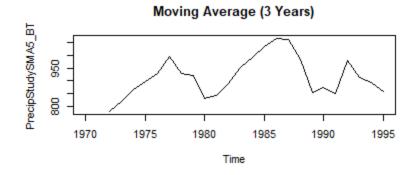


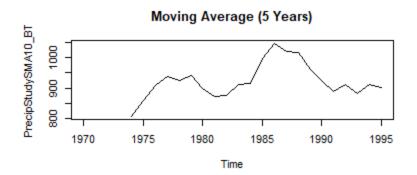
Precipitation significantly varies year-to-year with maxima around 1985 and minima around 1989.

### 2.3 Decomposition of the times series data into the constituent components:









In my opinion, moving average using 3 years window best conveys the trend since the window size of 2 years still retains the noise whereas 5 years appears to over smoothen the data (leading to loss of details).

### 2.4 Stationarity:

```
Augmented Dickey-Fuller Test

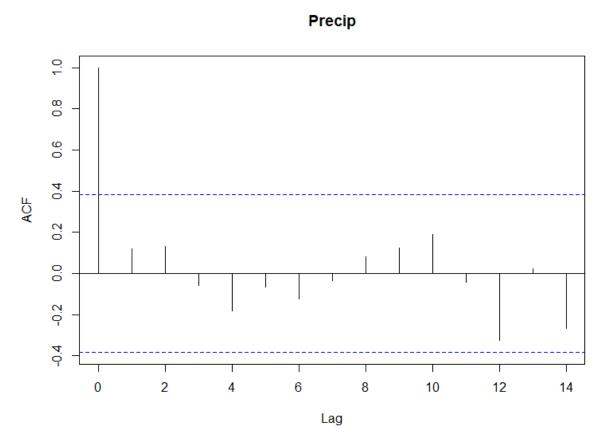
data: PrecipStudy_BT

Dickey-Fuller = -2.5257, Lag order = 2, p-value = 0.3721

alternative hypothesis: stationary
```

Augmented Dickey-Fuller test resulted in a p-value greater than .05 indicating that time series is non-stationary.

#### 2.5 Autocorrelation chart:



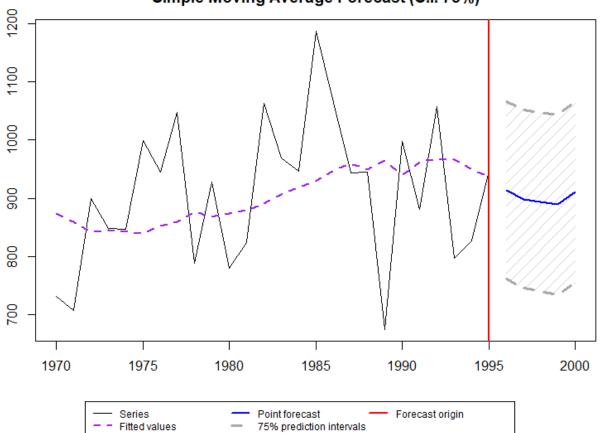
All the lags, except lag 0 (i.e., the correlation of a time series with itself), are not significant as they fall within horizontal blue lines which are the approximate 95% confidence intervals. This means that previous values do not seem to be influencing the current values.

### 3. Forecast

### 3.1 Simple Moving Average Forecast

```
Time Series:
Start = 1996
End = 2000
Frequency = 1
     Point forecast Lower bound (12.5%) Upper bound (87.5%)
1996
           913.6000
                                761.3417
                                                     1065.858
1997
           898.5000
                                745.4823
                                                     1051.518
1998
           893.9700
                                740.0385
                                                     1047.902
1999
           888.8970
                                733.8669
                                                     1043.927
2000
           910.3067
                                753.9577
                                                     1066.656
```

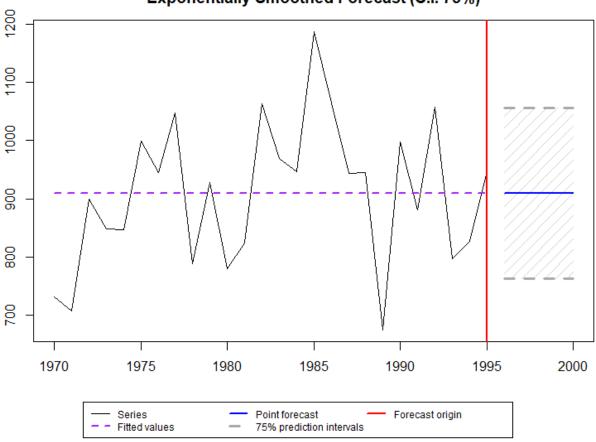
# Simple Moving Average Forecast (C.I. 75%)



#### 3.2 Exponentially Smoothed Forecast

```
Time Series:
Start = 1996
End = 2000
Frequency = 1
     Point forecast Lower bound (12.5%) Upper bound (87.5%)
1996
           909.5462
                                  763.072
                                                       1056.02
1997
           909.5462
                                  763.072
                                                       1056.02
1998
           909.5462
                                  763.072
                                                       1056.02
1999
                                  763.072
           909.5462
                                                       1056.02
                                  763.072
2000
           909.5462
                                                       1056.02
```

### Exponentially Smoothed Forecast (C.I. 75%)



#### 3.3 Conclusion

In general, recent years are better for predicting future years. So, in this case, exponential smoothing forecast seems to stand better for forecasting temperature in Waterloo. It appears that the overall trend is relatively constant. It is not going upward or downward. In the case of moving average, we can observe that the trend appears to go first downwards and then upwards, for which we have no reasoning.