

Time Series Analysis

Lecture 3

Autoregressive Models and Moving Average Models

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Moving Average Models

Modeling Using Real-World Data: The Data
and Descriptive Statistics

The Data Used in This Example

- Instead of using the data (British pounds vs. New Zealand dollar (NZD)) series provided by the textbook, I downloaded the monthly US dollar–NSZ dollar exchange rate series from the Federal Reserve website:

<http://research.stlouisfed.org/fred2/series/EXUSNZ/downloaddata>





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Monthly Rates

39 Series

U.S. / New Zealand Foreign Exchange Rate

☐ U.S. Dollars to One New Zealand Dollar, Monthly, Not Seasonally Adjusted

1971-01 to 2015-04 (5 days ago)

[nation](#) [usa](#) [nsa](#) [monthly](#) [frb](#) [currency](#) [exchange rate](#) [g5](#) [new zealand](#)

The Data Used in This Example (2)

- The advantage of obtaining the data series from the official source is that you have complete control over modification and transformation made to the series.
- I will still use the data series provided by the book later in this lecture because I want to extend the example used in the book.
- Alternatively, one could use function in the R library “**quantmod**” to stream the data directly, which I will do in the next lecture.
- **Quantmod** is especially designed for financial time series analysis, and I will not go into the details of this library.

The Data Used in This Example (3)

U.S. / New Zealand Foreign Exchange Rate

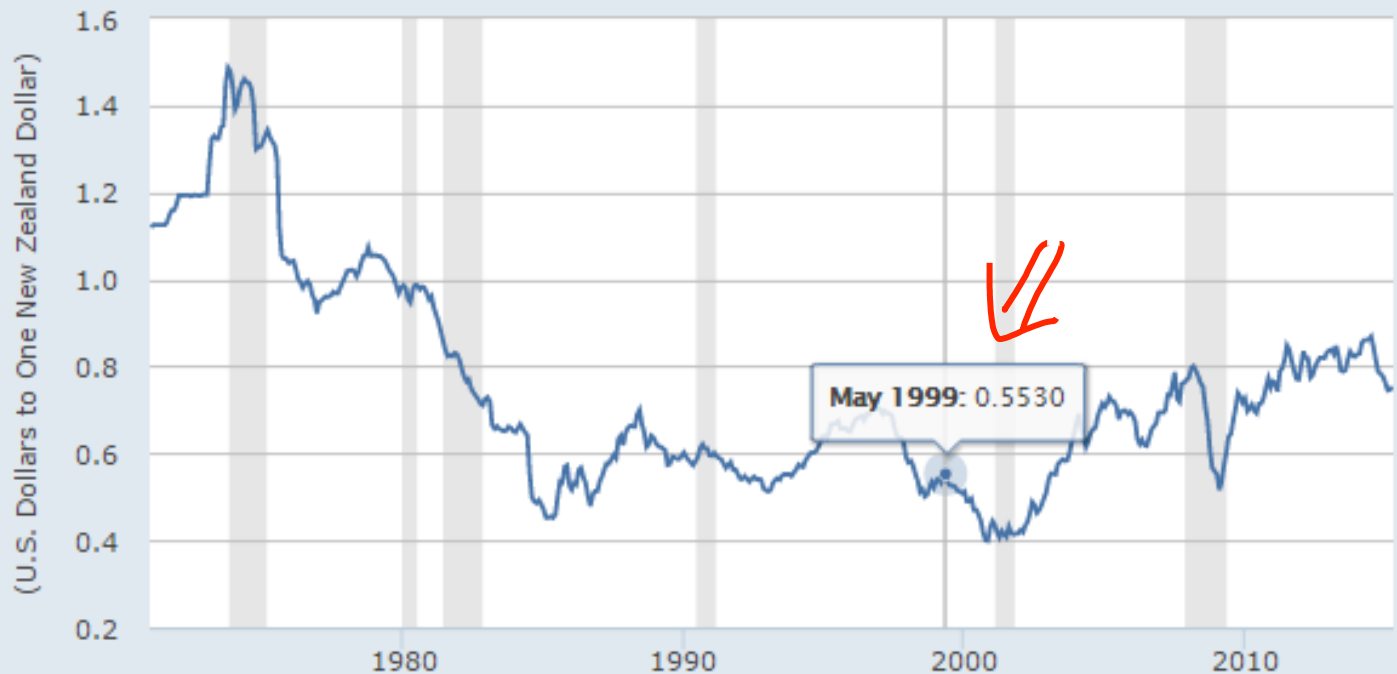
2015-04: **0.7540** U.S. Dollars to One New Zealand Dollar (+ see more)

Monthly, **Not Seasonally Adjusted**, EXUSNZ, Updated: 2015-04-13 3:41 PM CDT

Click and drag in the plot area or select dates: 1yr | 5yr | 10yr | Max to

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— U.S. / New Zealand Foreign Exchange Rate



The data series is not seasonally adjusted.

This graph is provided in the FRED website:
<http://research.stlouisfed.org/fred2/series/EXUSNZ>

Examine the Basic Structure of the Data

Import the data from a csv file, and name the data.frame exusnz.

```
exusnz <- read.csv("C:/Users/K/z_Teach/MIDS_AdvStat/data/EXUSNZ.csv",
  header=TRUE, stringsAsFactors=FALSE)
```

Then, we examine the basic structure of the data:

- 532 observations and 2 variables: date and the exchange rate called “value.”

```
> str(exusnz)
'data.frame': 532 obs. of 2 variables:
 $ DATE : chr  "1971-01-01" "1971-02-01" "1971-03-01" "1971-04-01"
 $ VALUE: chr  "1.1194" "1.1250" "1.1254" "1.1250" ...
```

- List the first and last few observations of the data.
- Always a good idea to list some observations to make sure it is what you would expect.

```
> cbind(head(exusnz), tail(exusnz))
      DATE  VALUE      DATE  VALUE
1 1971-01-01 1.1194 2014-11-01 0.7834
2 1971-02-01 1.1250 2014-12-01 0.7766
3 1971-03-01 1.1254 2015-01-01 0.7628
4 1971-04-01 1.1250 2015-02-01 0.7454
5 1971-05-01 1.1254 2015-03-01 0.7460
6 1971-06-01 1.1255 2015-04-01 .
```

This is unexpected!

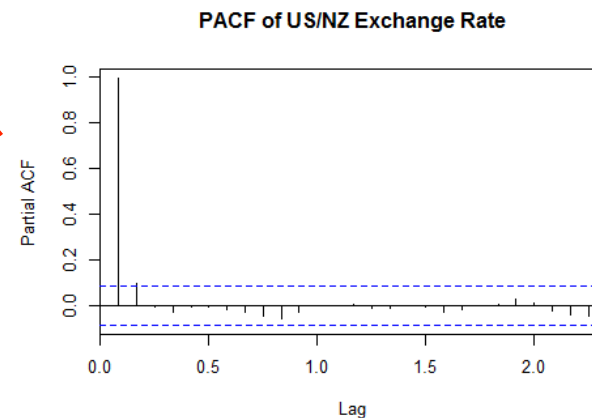
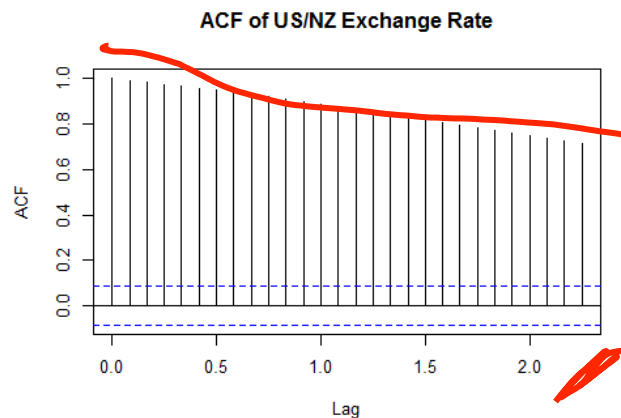
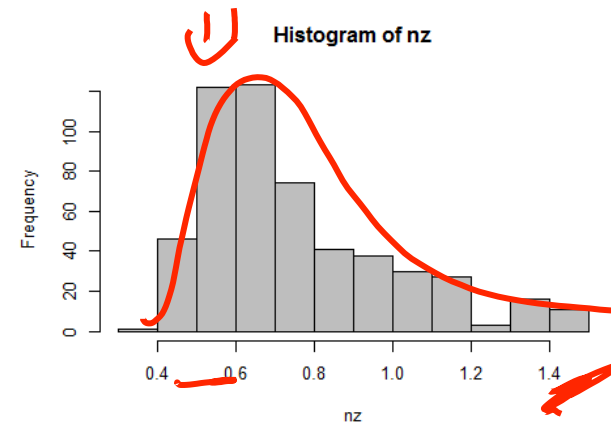
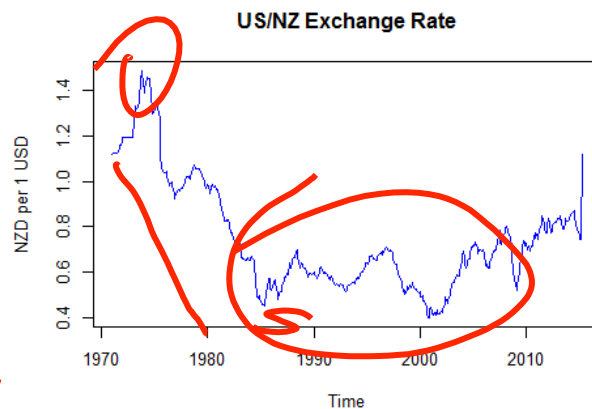
Clean Up the Data—Handling Missing Values

- Delete the last observation. (Note that I could have gone back to the website, downloaded the series again, and examined whether or not the last observation is really unavailable. However, this exercise is for pedagogical purpose, so I simply use the series as is, which already has over 500 observations.)
- I delete the last observation because it contains a missing value, providing no information.
- In general, the root cause of missing values should be thoroughly examined, and one should never simply impute it with mean (or any other values) without a good reason of doing so. One should also not simply delete the information without understanding the reason.

```
> exusnz2 <- exusnz[-532,] # omit the last observation because it is
> str(exusnz2)
'data.frame': 531 obs. of 2 variables:
 $ DATE : chr  "1971-01-01" "1971-02-01" "1971-03-01" "1971-04-01" .
 $ VALUE: chr  "1.1194" "1.1250" "1.1254" "1.1250" ...
```

Data Visualization and Descriptive Statistics

- The visuals suggests that the series is not a sample path of a MA process.



Min.	1st Qu.	Median	Mean	3rd Qu.	Max.
0.40	0.57	0.68	0.75	0.85	1.49

1%	5%	10%	25%	50%	75%	90%	95%	99%
0.41	0.46	0.51	0.57	0.68	0.85	1.12	1.30	1.45

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