Financial Forecasting

M.Sc. in Finance – 2018/19 – 1st Semester

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Classes: 1. Tuesdays: 18:00-21:00 2. Thursdays: 19:30-22:30

Textbook: Gloria Gonzalez-Rivera, Forecasting for Economics and Business, Pearson, 2013

Complement: A. A. Costa (1998). Notes on pragmatic forecasting procedures and exponential smoothing, CEMAPRE working paper

Software: EViews, ISTM2000, or any other software with basic time series analysis and forecasting capability

Goals: To introduce the main topics in time series analysis and forecasting with an emphasis in financial applications. To develop essential time series forecasting practical ability.

Evaluation: Group work, and final exam

These slides are based on:

González-Rivera: Forecasting for Economics and Business, Copyright © 2013 Pearson Education, Inc. Slides adapted for this course. We thank Gloria González-Rivera and assume full responsibility for all errors due to our changes which are mainly in red

Week	Торіс	Text Chapters
Sep 18 / 20	Introduction to time series: trends, cycles, seasonality Forecasting: error and horizon, stationarity, transformations	1 3.1-2
Sep 25 / 27	Autocorrelation and partial autocorrelation. Univariate and multivariate data. Forecast horizon. Forecast weighting the past	3.3-3.4 4.1-2
Oct 02 / 04	Exponential smoothing	Costa 1-3, 5-6
Oct 09 / 11	WN and MA processes	6.1, 6.3
Oct 16 / 18	AR processes	7.1-2
Oct 23 / 25	Seasonality and Seasonal ARMA models	7.3
Oct 30 / tba	Recap and examples	8.1
Nov 06 / 08	ARMA model selection	8.2
Nov 13 / 15	ARMA forecasting, brief reference to error criteria and measures	8.3, 9.1-2
Nov 20 / 22	Deterministic and stochastic trends – unit roots	10.1-2
Nov 27 / 29	Unit roots, forecasting with ARIMA models	10.2
Dec 04 / 06	Volatility	13.1-3
Dec 11 / 13	ARCH and GARCH models	13.5, 14.1

- Forecasting: both science and art
- Forecasting:
 - Events: stochastic processes
 - Values: time series
- Time series: collection of values indexed by time
 - can be qualitative, ordinal, integer values, real value
 - can be univariate or multivariate
 - can be observed or random variables in a model

CHAPTER 1 INTRODUCTION AND CONTEXT

1.3 Becoming Familiar with Economic Time Series: Features of a Time Series

Figure 1.1 Population of the United State at 10-year Intervals (1790-2000)



Source: http://www.census.gov/compedia/statab/cats/population.html

González-Rivera: Forecasting for Economics and Business, Copyright © 2013 Pearson Education, Inc.

1.3.1 Trends

Figure 1.2 Quarterly Productivity, Output, and Hours (Non-Farm Business Sector)

Where can you see a trend?17What's a trend?16What's a trend?14- long run13- monotonic change121111



Source: Bureau of Labor Statistics



Figure 1.3 Annual Hours Worked in the OECD Countries 1979-2006

Source: http://www.oecd.org

1.3.2 Cycles

Cycle: "When a time series exhibits periodic fluctuations, we say that it has a cycle . The cycle may be seasonal or nonseasonal."

- Usually cycles have no fixed periods

- Many people distinguish cycles and seasonality

"A cycle is seasonal when specific fluctuations occur within the calendar year, for instance activities that peak in summer months (or in specific quarters, days, hours, etc.)

Figure 1.4 Unemployed Persons (Seasonally Adjusted), Monthly Data 1988-2008



Source: St. Louis Federal Reserve Bank. FRED

- Seasonality usually refers to fixed periods, or almost fixed

1.3.3 Seasonality

Figure 1.5 Number of People in Poverty and Poverty Rate, Yearly Data 1959-2006



Figure 1.6 Revenue Passenger Enplanements. Monthly Data 200-2008



Source: Bureau of Transportation Statistics





Source: National Association of Realtors

Basic idea: decomposition of economic and financial time series:

$$Y_{t} = T_{t} + C_{t} + S_{t} + e_{t}$$

or
$$Y_{t} = T_{t} \cdot C_{t} \cdot S_{t} \cdot e_{t}$$

1.4 Basic Notation and the Objective of the Forecaster

1.4.1 Basic Notation

Description	Technical name	Notation
Object to analyze:	Time series	$\{y_t\}$
Value at present time <i>t</i> :	Known value of the series	y_t
Future at time $t+h$:	Random variable	Y_{t+h}
Value at future time <i>t</i> + <i>h</i> :	Unknown value of the random variable	\mathcal{Y}_{t+h}
Collection of information :	Univariate information set Multivariate information set	$I_{t} = \{y_{1}, y_{2}, \dots, y_{t}\}$ $I_{t} = \{y_{1}, y_{2}, \dots, y_{t}, x_{1}, x_{2}, \dots, x_{t}\}$
Final objective:	Forecast 1-step ahead <i>h</i> -step ahead	$\begin{array}{c} f_{t,1} \\ f_{t,h} \end{array}$
Uncertainty:	Forecast error	$e_{t,h} = y_{t+h} - f_{t,h}$

There are alternative notations

1.4.2 The Forecaster's Objective

Figure 1.8 The Forecasting Problem

