## HE 3022 – Econometric Modelling and Forecasting

### Semester 2, 2019-2020

## **Course Aims**

This course will introduce you to a wide range of methods and models used in forecasting in business and economics. You will be familiar with the processes of forecasting, qualitative and quantitative forecasting methods, data analysis and selection of the appropriate forecasting models and implementation of forecasting. You will also know how to use and apply R-statistical packages to implement the models using real data. Prior knowledge of R software is not required for the course.

## **Intended Learning Outcomes**

By the end of this course, you will be able to:

- 1. Show good knowledge of the qualitative and quantitative forecasting processes;
- 2. Identify patterns in time series data;
- 3. Estimate and interpret bivariate and multivariate regression models for forecasting;
- 4. Decompose different components of time series data;
- 5. Apply a variety of smoothing methods;
- 6. Identify and interpret univariate models;
- 7. Apply the forecasting methods and processes to real-world data from business and economics.
- 8. Use the appropriate R-statistical packages to implement the forecasting models.

Lecture Schedule (The schedule may be revised during the semester)

Teaching Week No.	Topics	Readings	
1	Introduction to R	HA 'Using R" & Ch.	
	Introduction to Forecasting (Getting Started)	1 (2 <sup>nd</sup> edition)	
1-2	Forecasting toolboxes-time series graphics Times series patterns Seasonal plots	HA Chapter 2 ( 2 <sup>nd</sup> edition)	
	Scatter plots Lag plots Autocorrelation White noise		
2-3	Forecaster's toolboxes Simple forecasting methods Transformation and adjustments Evaluating forecast accuracy Residual diagnostics Prediction intervals Forecast package in R	HA Chapter 3 (2 <sup>nd</sup> edition)	
4-5	Forecasting using linear regression Review of linear regression Evaluating the regression model Forecasting with regression	HA Chapter 5 (2 <sup>nd</sup> edition)	

	Prediction intervals for aggregates	Sections 12.4 & 12.5
	Forecast Combinations	HA Chap 12
	Bootrapping and bagging	
	Neural Network models	1
	Advanced Seasonality Vector Autoregressions	HA Chap 11
11-12	Selected Advanced Topics	
	Lagged predictors	
	Dynamic harmonic regressions	
	Forecasting	
	Regression with ARIMA errors in R	
	Estimation	edition)
10	Dynamic regression models	HA Chapter 9 (2 <sup>nd</sup>
	AMINA VS E15	
	Seasonal ARIMA models ARIMA vs ETS	
	Forecasting Seasonal ARIMA models	
	ARIMA modelling in R	
	Estimation and order selection	
	Non-seasonal ARIMA models	
	Moving average models	
	Autoregressive models	
	Stationarity and differencing Backshift notation	edition)
8-9		HA Chapter 8 (2 <sup>nd</sup>
0.0	ARIMA models	TIA CIL . O CONS
	Forecasting with ETS models	
	Innovations of state space model	
	Taxonomy of exponential smoothing	
	Holt-Winters' Seasonal method	
	Trend methods	edition)
/ <b>-</b> 0	Simple exponential smoothing	edition)
7-8	Exponential Smoothing	HA Chapter 7 (2 <sup>nd</sup>
	Forecasting with decomposition	
	STL decomposition	
	SEATS decomposition	
	X-11 decomposition	
	Classical decomposition	
	Moving averages	Cultion)
U	Time series components	edition)
6	Time series decomposition	HA Chapter 6 (2 <sup>nd</sup>
	Correlation, causation and forecasting	
	Non-linear regression	
	Matrix formulation	
	Residual diagnostics	
	Selecting predictors	
	Some useful predictors	
	Review of multiple regression	
	Forecasting using multiple regression	

#### **Main Text**

(HA) Hyndman, R., and Athanasopoulus, Forecasting: Principles and Practice (second edition) at http://otexts.org/fpp2/index.html.

## **References** (To be updated during the semester)

Introduction to R

- Try R Code School (http://tryr.codeschool.com/)
- DataCamp Introduction to R (https://www.datacamp.com/courses/free-introduction-to-r)
- R tutorial (Clarkson University) (http://www.cyclismo.org/tutorial/R/)
- Coursera R Programming (https://www.coursera.org/learn/r-programming)
- Google search for commands and errors

## Reference for R

• Kickstarting R (https://cran.r-project.org/doc/contrib/Lemon-kickstart/index.html)

# Time series analysis in R

• Using R for Time Series Analysis (<u>http://a-little-book-of-r-for-time-series.readthedocs.io/en/latest/src/timeseries.html</u>)

Course Assessment				
Course Work				
<ul> <li>Attendance and turning point exercises</li> </ul>	20			
• Assignments	20			
Notes:				
Turning point exercises are treated as quizzes. Please inform me immediately if you have problems/issues with Turning point and your devices. If the problems with your devices cannot be resolved, I am sorry that I cannot accept answers on pieces of papers after the exercises because the answers are shown right after the questions. It is not fair to those who have answered using Turningpoint. You will receive a grade of B for either wrong answers or defective devices. Correct answers will receive an A.				
At the end of the semester your lowest mark for the turningpoint exercises will be removed				
You will be excused only from Turning point exercises and class participation if you have a medical certificate (MC) <i>officially</i> submitted to HSS.				
Final Exam				

Faculty	Office	Tel.	Email
Dr. Joseph D. Alba	HSS-04-80	6790-6234	ajoalba@ntu.edu.sg

Announcement: There will be no class 28 January 2020.