

UNIVERSITY OF THE PHILIPPINES DILIMAN SCHOOL OF STATISTICS TM KALAW STREET, UP DILIMAN QUEZON CITY PHILIPPINES



STAT 268: ADVANCED TIME SERIES ANALYSIS

COURSE SYLLABUS

Instructor: Assoc Prof Peter Julian Cayton, PhD Consultation Hours: Weekdays, 1:00-5:00pm

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COURSE GOALS

The course covers a survey of advanced methodologies in time series analysis. The course builds from a student's strong background in time series analysis and expands their skills to tackle more complex problems in extracting insights from time series data.

At the end of the course, the student is expected to be able to:

- I. Analyze the interactions and correlations of multiple time series data,
- II. Build sophisticated time series model systems through state space modeling,
- III. Perform analysis and prediction with nonlinear and nonparametric time series methodologies,
- IV. Analyze the periodic features of time series data thru frequency domain analysis,
- V. Analyze the nature of interventions in time series data, and
- VI. Discern which advanced time series methodology applies to a specific problem.

COURSE REQUIREMENTS:

Online Exercises. They are preferred to be given after a specific set of topics.

GRADING FORMULA: Final Grade = (Sum of exercise scores)/(Total number of points of all exercises) x 100%

GRADING SCALE

[96.00, ∞)	1.00	[72.00, 78.00)	2.00
[90.00, 96.00)	1.25	[66.00, 72.00)	2.25
[84.00, 90.00)	1.50	[60.00, 66.00)	2.50
[78.00, 84.00)	1.75	[0.00, 60.00)	INC

CLASS RULES AND POLICIES

- 1. Cellphones and other electronic devices should be turned off or silent during class sessions. Classroom decorum should always be observed. You are free to mute and stop your camera to settle your personal or emergency businesses then turn up again. The instructor reserves the right to send a student that disturbs a class out of the session.
- 2. If students are caught cheating in any form concerning the requirements of the course, they will receive a grade of 5.00 and their case will be sent to the Student Disciplinary Tribunal for further action by the University.
- 3. The instructor will be creating online facilities for our class on UVLE (https://uvle.upd.edu.ph). Please wait for announcements on the coming days for the details of these group pages.
- 4. Any communication about the course can only be conducted during consultation hours by sending communications through email or the UVLE messaging facility. Instructors will not be communicated through personal Facebook, nor other means not mentioned.
- 5. The course pack contains the following materials:
 - 1) the course syllabus and schedule of activities,
 - 2) lecture videos for viewing,
 - 3) the main readings of discussion, and

- 4) Data for discussions and exercises
- 6. Additional materials will be available in UVLE.
- 7. Exercise papers will be accessible in UVLE and the deadline is two weeks from the first release of the exercise.
- 8. A passing standing is defined as having a grade of 60 or higher given the graded requirements. Otherwise, it would be a failing standing.
- 9. If you are to drop the course, please accomplish the necessary online forms on or before the date of last day of dropping. Pay the necessary amount and provide me the instructor's copy for my record purposes and to officially give you a grade of DRP in the course.
- 10. An INC grade would require you to complete the requirement that you have missed or gain extra points thru extra work. You have 2 semesters to complete your deficiencies.
- 11. For publicly available computing, students may use Google Colab with R language, accessible thru these links: https://colab.research.google.com/#create=true&language=r, or this short URL https://colab.to/r.
- 12. <u>Course Materials and Assessments:</u> The materials provided to you are for educational purposes only. Please do not share these materials with anyone else without the teacher's permission. No part of it can be reproduced for commercial distribution through manual and electronic means without the knowledge of the authors or copyright owners.
- 13. <u>Classroom Al Policy:</u> Recent developments in artificial intelligence, e.g. ChatGPT, have made it as a powerful tool to improve a student's writing and delivery of ideas. Students may use Al tools to improve their work; however, it should not be used as substitute to the student's own writing. The student bears responsibility to the veracity of written statements they submit under their name in their requirements. They are also responsible for editing and proper referencing of their written works to academic standards. The instructor reserves the right to assess the work thru certified anti-plagiarism software, e.g., Turnitin, to check for academic integrity. For more information, please also refer to the UP Al policy: https://up.edu.ph/up-principles-for-responsible-artificial-intelligence/.

TENTATIVE COURSE SCHEDULE AND OUTLINE (Sequences and dates may change as we go along the course)

Topics	Reference		
PROLOGUE: Review of Introductory Time Series Analysis			
Week 1: Introductory Time Series Analysis	FPP2		
1.1 Syllabus of the Course	RUGARCH		
1.2 Stochastic Processes			
1.3 Autocorrelations and Partial Autocorrelations			
1.4 White Noise, Stationary, and Nonstationary Time Series			
1.5 ARIMA Models			
1.6 Dynamic Regression Models			
1.7 GARCH Models			
PART I: Interrupted Time Series Analysis			
Week 2: Interrupted Time Series Analysis	ITSASP		
2.1 Basic Ideas in Interrupted Time Series Analysis	TSAAR: Sec. 11.1		
2.2 Intervention Models	ITSARP		
2.3 Estimation of Intervention Models thru Software	ITSAOUP		
EXERCISE 1: Answer problems using methods from Part I			
PART II: Frequency Domain and Spectral Analysis			
Week 3: Introduction to Spectral Analysis	TSAAR: Ch. 13 & 14		
3.1 Spectral Representation and Spectral Distribution	TATSAIR: Ch. 6 & 7		
3.2 Spectral Densities of the ARMA process	TSDAAUR: Ch 6 & 7		
Week 4: Estimating the Spectrum			
4.1 Smoothing the Sample Spectral Density			
4.2 Interval Estimation for the Spectrum			

4.3 Example Estimation thru Software				
EXERCISE 2: Answer problems using techniques from Part II	I			
PART III: Vector Models for Multivariate Time Series				
Week 5: Vector Autoregression (VAR) Models	AICTSR: Ch. 2			
5.1 Estimation and Diagnostics	MTSA: Ch. 1, 2, & 4			
5.2 Granger Causality	WITSA. CII. 1, 2, & 4			
5.3 Impulse Response Functions				
5.4 Forecast Error Variance Decomposition				
Week 6: Structural VAR Models	 			
6.1 Estimation and Diagnostics				
6.2 Impulse Response Functions				
6.3 Forecast Error Variance Decomposition				
Week 7: Cointegration and Vector Error Correction Models	AICTSR: Ch. 4, 7, & 8			
7.1 Cointegration	MTSA: Sec. 5.5 – 5.10.			
7.1 Confedition 7.2 Univariate Error Correction Model	WITSA. Sec. 5.5 – 5.10.			
7.3 Vector Error Correction Model				
EXERCISE 3: Answer problems using methods from Part III				
PART IV: Multivariate GARCH Models	NATCA : Co. 7.4. 7.7			
Week 8: Multivariate GARCH Models	MTSA: Sec 7.1 - 7.7			
8.1 Estimating Multivariate Volatility Models				
8.2 Diagnostic Checks				
8.3 Multivariate GARCH and Correlation Models				
EXERCISE 4: Answer problems using methods from Part IV				
PART V: State Space Models				
Week 9: Linear Gaussian State Space Model I	TSASSMR: Ch 8 & 9			
9.1 The General Linear Gaussian State Space Model	TSASSM: Ch 3			
9.2 The Kalman Filter Algorithms	STATESPACER			
9.3 Forecasting with State Space Models	<u> </u>			
Week 10: Linear Gaussian State Space Model II				
10.1 Example: Trend & Seasonal Component Models				
10.2 Example: ARIMA Models				
10.3 Example: Regression Models				
10.4 Example: Dynamic Factor Models				
EXERCISE 5: Answer problems using methods from Part V				
PART VI: Nonlinear & Nonparametric Time Series Analysis				
Week 11: Threshold Models	TSAAR: Ch 15			
11.1 Exploring Nonlinearities in Time Series				
11.2 Threshold AR (TAR) Models				
11.3 Model Diagnostics				
EXERCISE 6: Answer problems using methods from Week 11	•			
Week 12: Nonparametric Regression for Time Series	ANR: Ch 7			
12.1 Introduction	NLTSR			
12.2 Nonparametric Time Series Analysis				
12.1 Software Implementation				
Week 13: Bootstrap and Boosting in Time Series	AIBMAR: Ch 5			
13.1 Residual-Based Bootstrap	FPP2: Section 11.4			
13.2 Block Bootstrap	XGBOOST			
13.3 Dependent Wild Boostrap				
13.4 Bagged Forecasts				
13.5 XGBoost for Time Series				
EXERCISE 7: Answer problems using methods from Weeks 12 & 13				
Transfer 7. Answer problems using methods from weeks 12 & 15				

Main References for the Course:

(STATESPACER): Beijers D (2023). statespacer: State Space Modelling in R. R package version 0.5.0, https://dylanb95.github.io/statespacer/.

(NLTSR): Bjornstad ON (2018). nlts: Nonlinear Time Series Analysis. R package version 1.0-2, https://CRAN.R-project.org/package=nlts.

(TATSAIR): Chatfield C & Xing H (2019). The analysis of time series: an introduction with R, Seventh Ed. CRC Press.

(XGBOOST): Chen T & Guestrin C (2016). XGBoost: A Scalable Tree Boosting System. In Proceedings of the 22nd ACM SIGKDD International Conference on Knowledge Discovery and Data Mining (KDD '16). Association for Computing Machinery, New York, NY, USA, 785–794. https://doi.org/10.1145/2939672.2939785.

(AIBMAR): Chernick MR & LaBudde RA (2011). AN INTRODUCTION TO BOOTSTRAP METHODS WITH APPLICATIONS TO R. Wiley.

(TSAAR): Cryer JD & Chan K-S (2008). Time Series Analysis With Applications in R, Second Edition. Springer Science+Business Media, LLC.

(TSASSM): Durbin J & Koopman SJ (2012). Time Series Analysis by State Space Methods, Second Edition. Oxford University Press

(ITSARP): English, Patrick, The its.analysis R Package – Modelling Short Time Series Data (June 6, 2019). Available at SSRN: https://ssrn.com/abstract=3398189 or http://dx.doi.org/10.2139/ssrn.3398189

(RUGARCH): Ghalanos A (2014), rugarch: Univariate GARCH Models, R package version 1.4-0.

(TSASSMR): Hagiwara J (2021). Time Series Analysis for the State-Space Model with R/Stan. Springer.

(ANR): Hardle W (1994). Applied Nonparametric Regression. Humboldt-Universitet zu Berlin.

(FPP2): Hyndman RJ, & Athanasopoulos G (2018) Forecasting: principles and practice, 2nd edition, Melbourne, Australia: OTexts. OTexts.com/fpp2. Accessed on 26 July 2019.

(ITSASP): McDowall D, McCleary R, Meidinger EE, & Hay RA Jr (1980). Interrupted Time Series Analysis. SAGE PUBLICATIONS.

(ITSAOUP): McDowall D, McCleary R, & Bartos BJ (2019). Interrupted Time Series Analysis. Oxford University Press.

(AICTSR): Pfaff B (2008). Analysis of Integrated and Cointegrated Time Series Analysis with R. Springer.

(TSDAAUR): Shumway RH & Stoffer DS (2019). Time series: a data analysis approach using R. CRC Press.

(MTSA): Tsay RS (2014). Multivariate Time Series Analysis. Wiley.