

# Time Series Analysis

Spring-Summer-Semester 2023

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University of Mannheim  
Department of Economics  
Chair of Statistics  
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# **Times Series Analysis (TSA) - Content**

**Introduction to TSA**

**Review of Basic Essentials**

**Basic Elements of TSA**

**Basic Properties of Time Series**

**Forecasting Theory**

**AR(I)MA Processes**

**ADL Models**

**VAR Models**

**Nonstationarity: Trend and Breaks**

**Estimation of Dynamic Causal Effects**

**Short Intro: Cointegration**

**Short Intro: ARCH and GARCH Models**

# Introduction to TSA

# General Course Information

## Prerequisites

- Students in Economics from Mannheim: no problem
- All other students: should have solid understanding of Basic Statistics and Basic Econometrics (a one-semester-all-in-one-course is not appropriate!)
- *Basic Econometrics* should have included (at least): OLS, Linear Multiple Regression (LMR), F-test for testing joint hypotheses,  $R^2$  and “adjusted  $R^2$ ” (on this level or more but not less)
- The statistical software *R* will intensively be used throughout this course. Students who are not yet familiar with *R* must work through chapters 1-5 of the *R introduction* (see course folder) on their own by February 22 at the latest.
- Though *R* is easy to learn, you need to invest some time at the beginning. But you may benefit from it for a long time.

# General Course Information

## Times and Locations

<b>Format</b>	<b>Day</b>	<b>Time</b>	<b>Method</b>
Lecture	Friday	12:00-13:30	L7, 3-5, 001
Group Exercise Session 1	Thursday	17:15-18:45	L9, 1-2, 002
Group Exercise Session 2	Friday	10:15-11:45	L9, 1-2, 003
Homework-Tut (optional)	Wednesday	15:00-16:30	in presence / via Zoom

Choose one of the two compulsory GE-Sessions! The Homework-Tutorial is not compulsory in terms of grading. It starts in the 2nd week.

## Contact

Office Hour: Wednesday, 3:00-4:30 p.m. in presence or via Zoom

Office: L7, 3-5, 1st floor, 143

Phone: 0621-181-3963

Email: [stocker@uni-mannheim.de](mailto:stocker@uni-mannheim.de)

# General Course Information

## Course Material

**Slides** (Lecture), **Assignments**, **'Introduction to R'** (see p. 2)

## References

Stock and Watson (2020):

*Introduction to Econometrics*; Pearson 4th ed.

Marno Verbeek (2008):

*A Guide to Modern Econometrics*; Wiley 3rd ed.

Brockwell and Davis (2002):

*Introduction to Time Series and Forecasting*; Springer

Brockwell and Davis (1991):

*Time Series: Theory and Methods*; Springer

Helmut Lütkepohl (2005):

*New Introduction to Multiple Time Series Analysis*; Springer

Schlittgen and Streitberg (2001):

*Zeitreihenanalyse*; Oldenbourg (in German)

## Examination

### Exam + Assignments:

80% written exam (120 minutes) + 20% Exercises (individual and collaborative part) in terms of points to earn in total.

### Example:

	Points
Written Exam:	60 (from 80)
<u>Exercises:</u>	<u>18 (from 20):</u>
Total:	78 (from 100)

=> Grading will be based on 78 points (from 100)

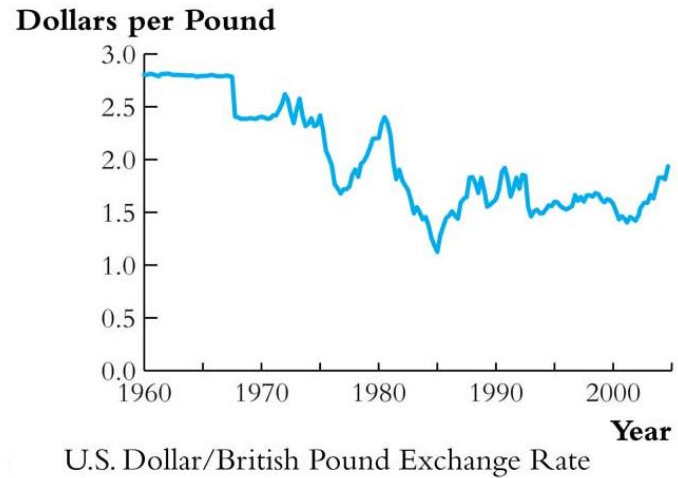
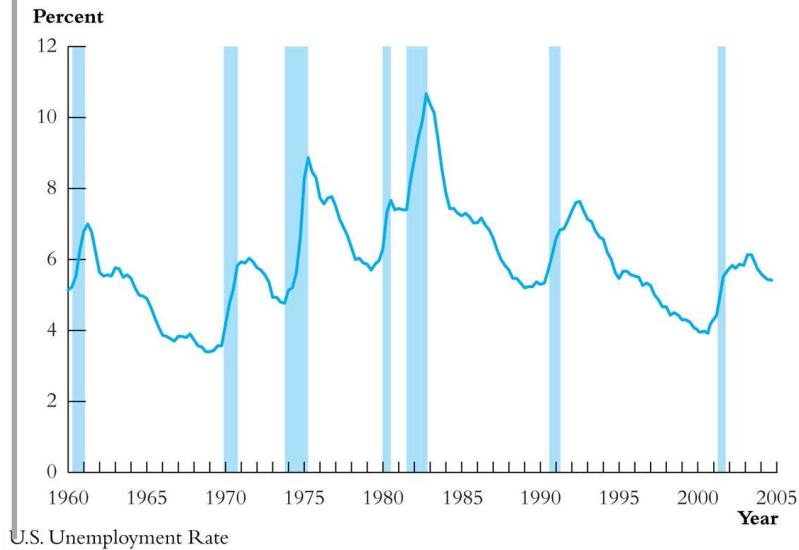
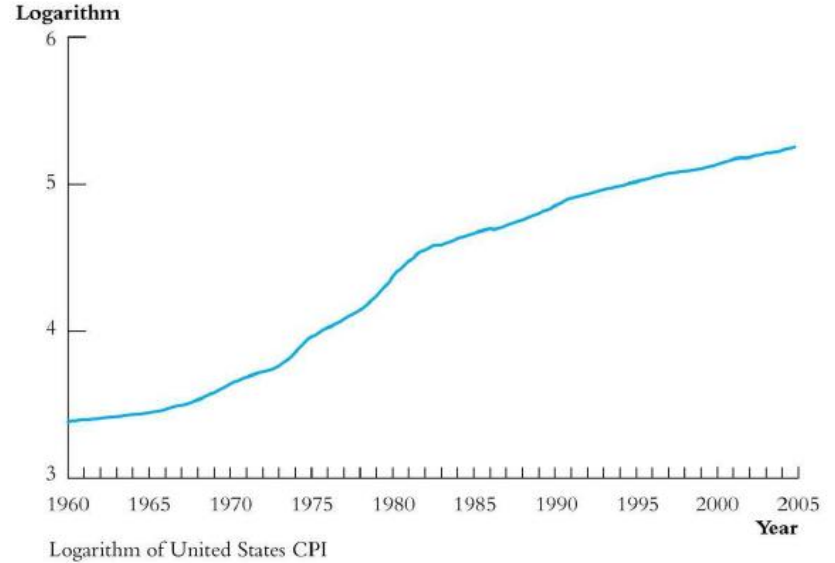
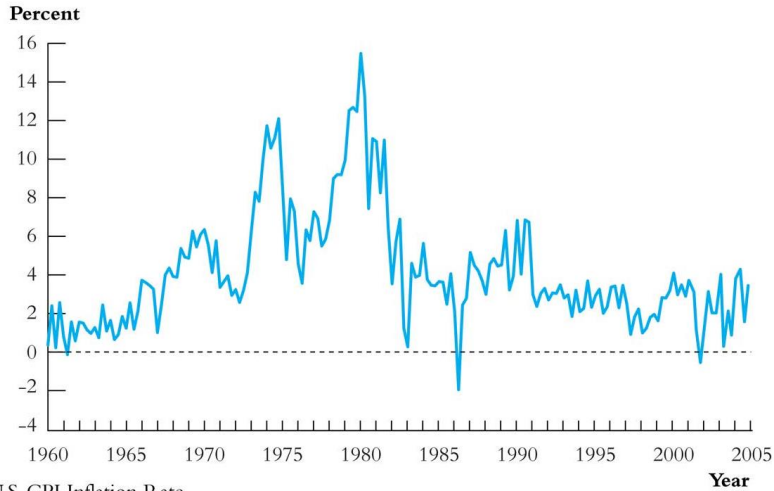
Minimum for passing:  $\leq 40$

### Assignments:

Need to submit homework and attend tutorial. To get full points (20) you need to work at least on 10 assignments (out of 13) in a meaningful way.  
(See *Course Guidelines*)

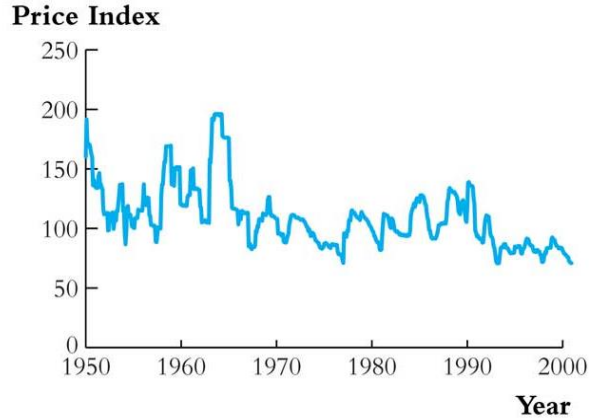
# What is it about?

## Examples (taken from S&W)

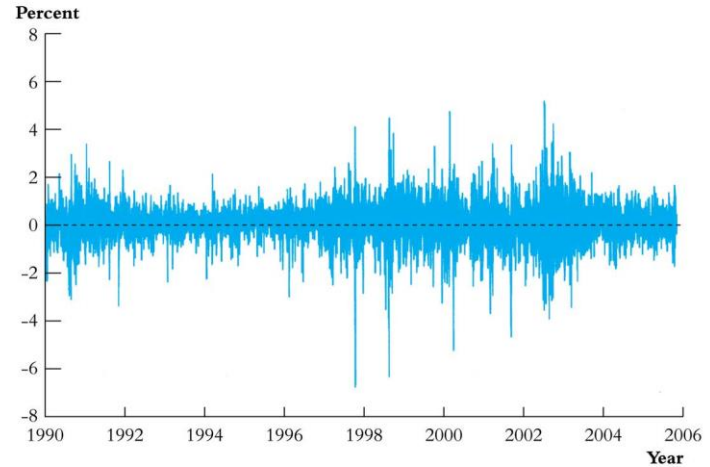




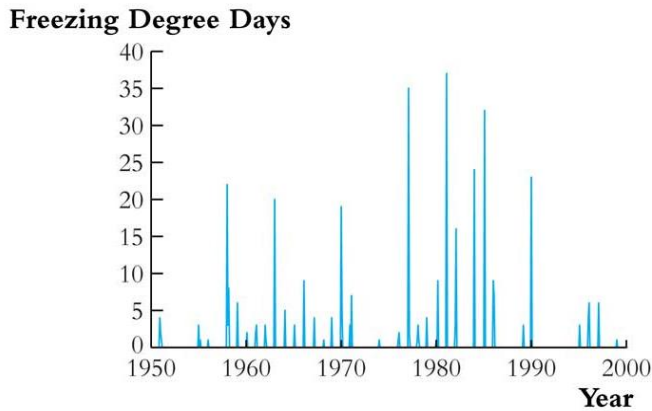
# What is it about?



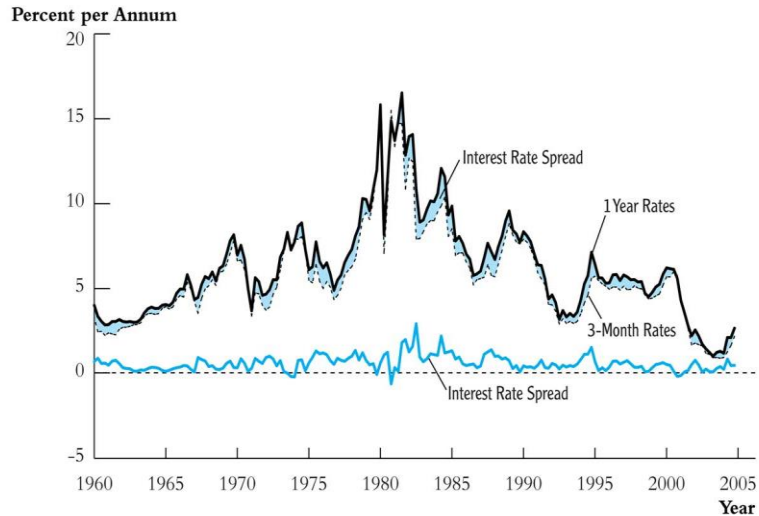
(a) Price Index for Frozen Concentrated Orange Juice



Daily NYSE percentage price changes exhibit volatility clustering, in which there are some periods of high volatility, such as in the late 1990s, and other periods of relative tranquility, such as in the mid-1990s.



(c) Monthly Freezing Degree Days in Orlando, Florida



One-year and three-month interest rates share a common stochastic trend. The spread, or the difference, between the two rates does not exhibit a trend. These two interest rates appear to be cointegrated.

# What is it about?

## Issues of Time Series Analysis (TSA)

**Times Series data** are data collected on the same observational unit at multiple time periods

Further Examples:

- Aggregate consumption and GDP for a country  
(e.g., 20 years of quarterly observations = 80 obs.)
- Yen/\$, Pound/\$ and Euro/\$ exchange rates  
(e.g. daily data for 1 year = 365 obs.)
- Cigarette consumption per capita in a state, by year

## What is it about?

### New technical issues of TSA

- Time lags
- Correlation over time (*serial correlation* or *autocorrelation*)
- New types of regression models (using time lagged values)
  - *autoregressive models* (AR models)
  - *autoregressive distributed lag models* (ADL models)
- Other types of model assumptions (e.g. *stationarity*) needed (Why?)
- Other types of LLN's and CLT's needed
- New estimation techniques needed



This is an applied course. We will not deal with asymptotic theory in detail.

# What is it about?

## Course outline

- Lecture 0: Introduction to TSA
- Lecture 1: Review of Basic Essentials (part 1) **Assignment 1**
- Lecture 2: Review of Basic Essentials (part 2) **Assignment 2**
- Lecture 3: Basic Elements of TSA **Assignment 3**
- Lecture 4: Basic Properties of Time Series **etc.**
- Lecture 5: Forecasting Theory
- Lecture 6: AR(I)MA Processes (part 1)
- Lecture 7: AR(I)MA Processes (part 2)
- Lecture 8: ADL-Models
- Lecture 9: VAR-Models
- Lecture 10: Nonstationarity: Trend
- Lecture 11: Nonstationarity: Breaks
- Lecture 12: Estimation of Dynamic Causal Effects
- Lecture 13: Short Intro: Cointegration, ARCH and GARCH Models

*Note: This is just a plan!  
Topics may be skipped;  
Order may be changed;  
lecture topics may overlap*

# What is it about?

## Main Objectives

... at the end of the semester you

- know and (hopefully) understand most common TSA methods and their theoretical background
- know how to construct forecasting models, how to conduct model based forecasts and how to check model performance
- can proficiently use R for all important parts of TSA: constructing graphics, estimating and testing, forecasting, model diagnosis and assessment
- have experienced the possibilities and limitations of time series methods on the basis of real data examples



Generally: This is an introductory and applied course. We will not deal with all aspects and techniques of TSA. Some important topics will not be covered .