

# Analysis of Time Series, L1

Rolf Larsson

Uppsala University

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# Course overview

- Shumway and Stoffer:  
*Time Series Analysis and its Applications, with R examples, 4th ed.*  
Springer 2017.
- Chapters:
  - 1 Characteristics of Time Series (L1-2)
  - 2 Time Series Regression and Explanatory Data Analysis (L2)
  - 3 ARIMA Models (L3-9)
  - 4 Spectral Analysis and Filtering (L10-12)
  - 5 Additional Time Domain Topics (L13-16)
  - 6 State-Space Models (L17-18)

# Course overview

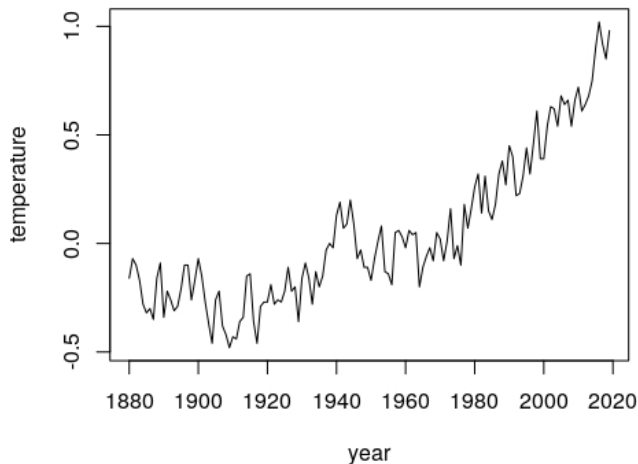
- 18 theory lectures with comments on studentportalen.  
Also some videos.
- Written exam (with book and/or homemade notes).
- Six hand in assignments, not compulsory but give bonus points.
- Project: Analyse your own time series. (Compulsory.)
- Please check “Studentportalen” for further information!  
(The file “kursinfo”, including a list of recommended exercises.)

# Today

- 1.1-2: Introduction, examples
- 1.3: Statistical models
- 1.4: Measures of dependence

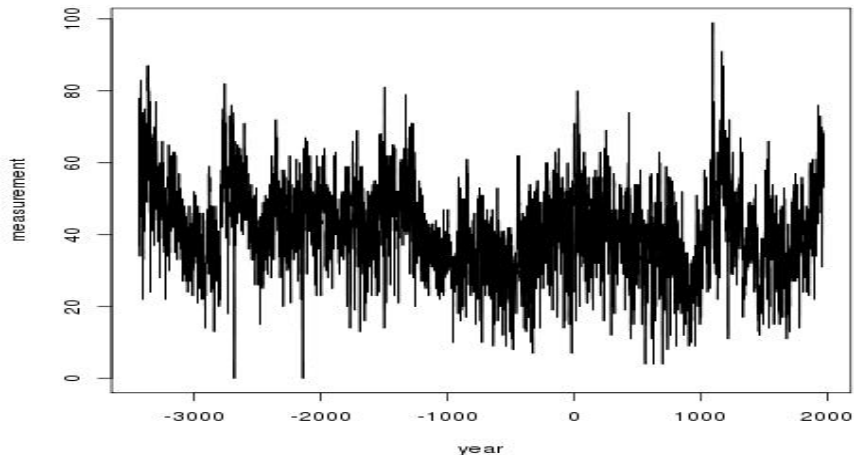
# Introduction, examples

**Global mean temperature, 1880-2019**



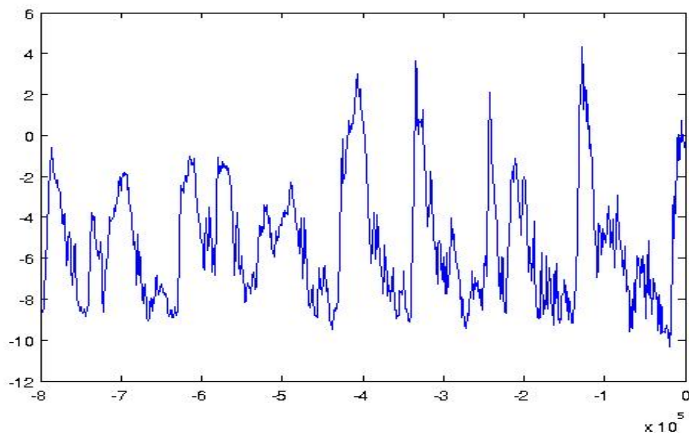
# Introduction, examples

**Mount campito tree ring data, 3435BC to 1969AD**

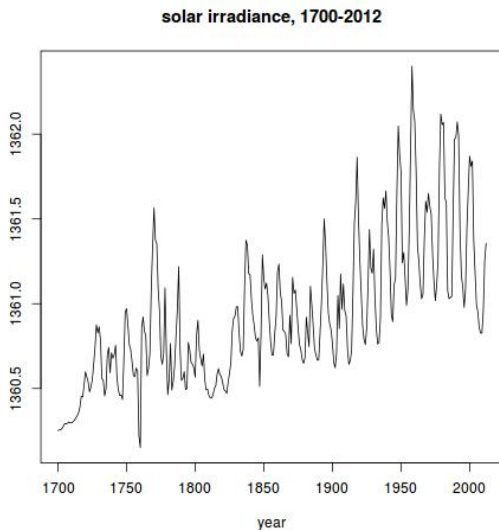


# Introduction, examples

Antarctic ice core temperature proxies from about 800 000 BC to now.

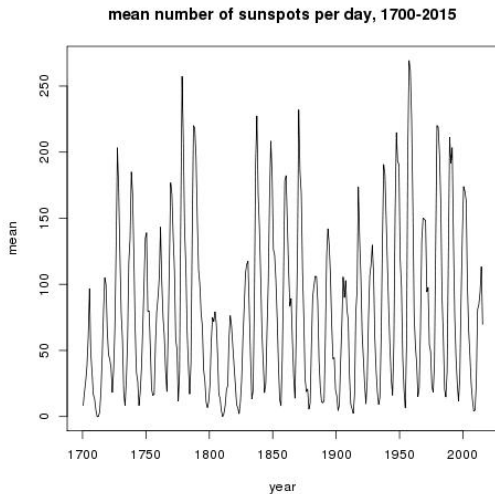


# Introduction, examples



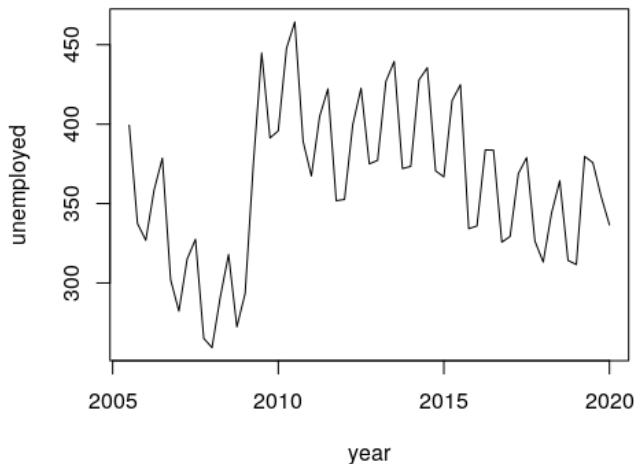


# Introduction, examples



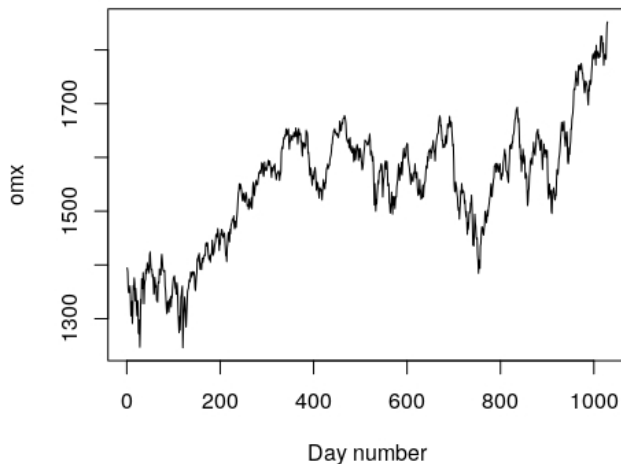
# Introduction, examples

**Unemployed in thousands, 2005:2-2019:4**

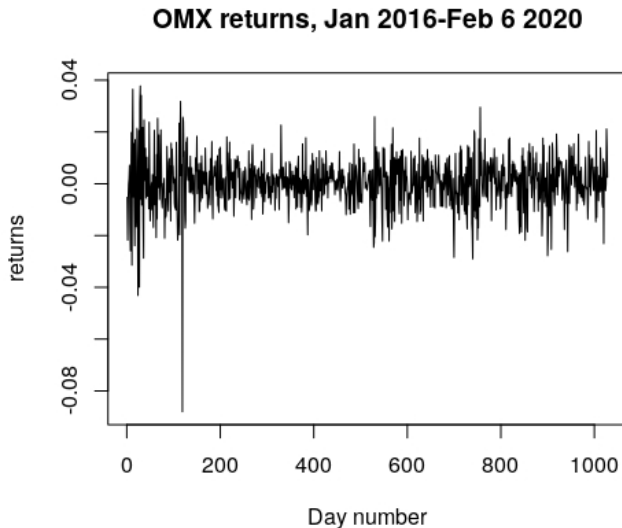


# Introduction, examples

**OMX Index, Jan 2016-Feb 6 2020**



# Introduction, examples



# Statistical models

## Definition (Stochastic process)

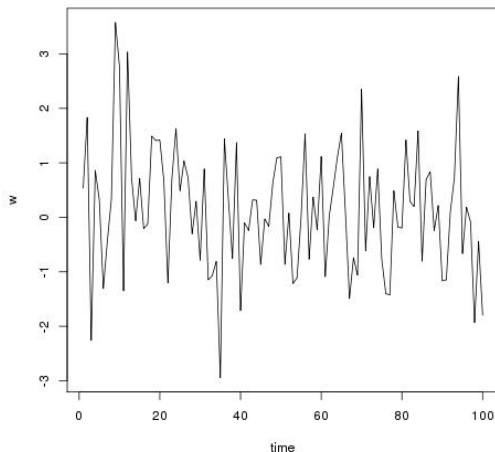
A collection of random variables  $\{x_t\}$  where  $t$  ranges over a set of integers, is called a *stochastic process in discrete time* (time series).

## Definition (Realization)

A collection of observed values of a stochastic process is called a *realization*.

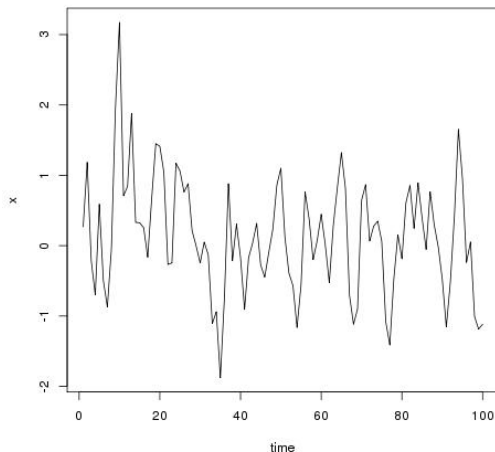
# Statistical models

Example 1: White noise,  $w_t \sim N(0, \sigma_w^2)$ , independent



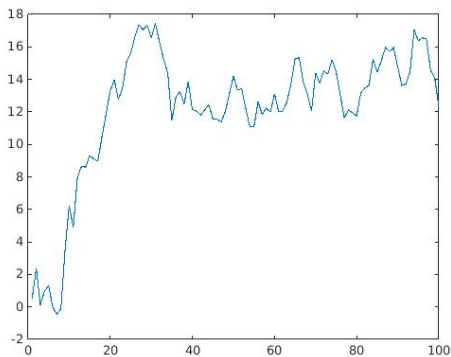
# Statistical models

Example 2: Moving average,  $x_t = \frac{1}{2}(w_t + w_{t-1})$



# Statistical models

Example 3: Random walk,  $x_t = x_{t-1} + w_t$





# Measures of dependence

## Definition (1.1)

The *mean function* of a stochastic process  $\{x_t\}$  is defined as

$$\mu_t = E(x_t).$$

## Definition (1.2)

The *autocovariance function* of a stochastic process  $\{x_t\}$  is defined as

$$\gamma(s, t) = \text{cov}(x_s, x_t).$$

## Definition (1.3)

The *autocorrelation function* of a stochastic process  $\{x_t\}$  is defined as

$$\rho(s, t) = \text{corr}(x_s, x_t) = \frac{\gamma(s, t)}{\sqrt{\gamma(s, s)\gamma(t, t)}}.$$

# Measures of dependence

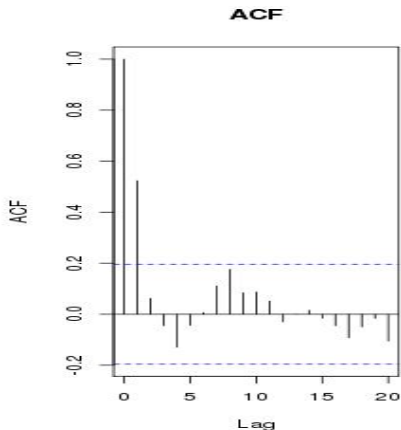
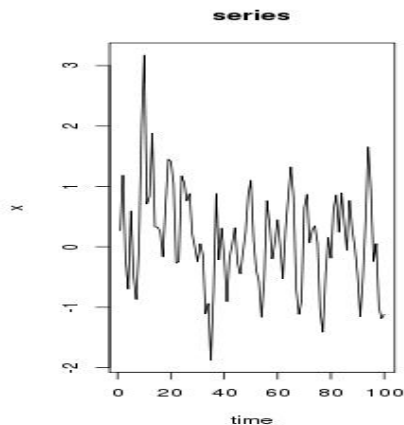
Calculate  $\mu_t$ ,  $\gamma(s, t)$  and  $\rho(s, t)$  for

- 1 the white noise process  $w_t$ .
- 2 the moving average process  $x_t = \frac{1}{2}(w_t + w_{t-1})$ .
- 3 the random walk process  $x_t = x_{t-1} + w_t$  where  $x_0 = 0$ .

In general, is it true that  $\gamma(s, t) = \gamma(t, s)$  and  $\rho(s, t) = \rho(t, s)$ ?

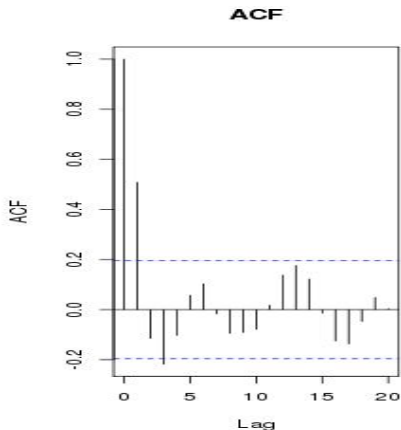
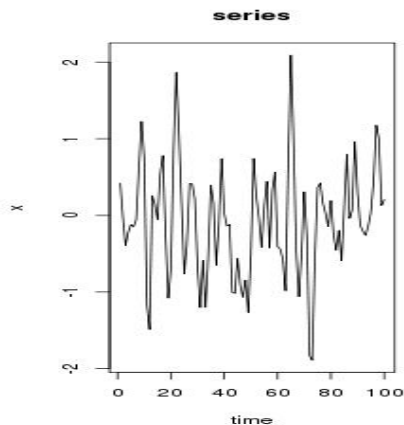
# Measures of dependence

Simulation one of  $x_t = \frac{1}{2}(w_t + w_{t-1})$



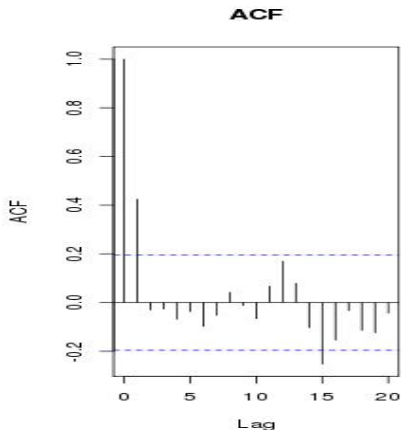
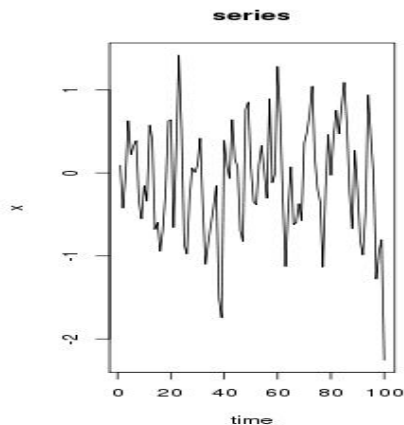
# Measures of dependence

Simulation two of  $x_t = \frac{1}{2}(w_t + w_{t-1})$



# Measures of dependence

Simulation three of  $x_t = \frac{1}{2}(w_t + w_{t-1})$



# Measures of dependence

## Definition (1.4)

The *cross-covariance function* between two series  $\{x_t\}$  and  $\{y_t\}$  is defined as

$$\gamma_{xy}(s, t) = \text{cov}(x_s, y_t).$$

## Definition (1.5)

The *cross-correlation function* between two series  $\{x_t\}$  and  $\{y_t\}$  is defined as

$$\rho_{xy}(s, t) = \text{corr}(x_s, y_t) = \frac{\gamma_{xy}(s, t)}{\sqrt{\gamma_x(s, s)\gamma_y(t, t)}}.$$

# Measures of dependence

Let  $x_t = \frac{1}{2}(w_t + w_{t-1})$  and  $y_t = w_t$ .

- 1 Calculate  $\gamma_{xy}(s, t)$  and  $\rho_{xy}(s, t)$ .
- 2 Calculate  $\gamma_{yx}(s, t)$  and  $\rho_{yx}(s, t)$ .

In general:

- 1 Is it true that  $\gamma_{xy}(s, t) = \gamma_{xy}(t, s)$  and  $\rho_{xy}(s, t) = \rho_{xy}(t, s)$ ?
- 2 Is it true that  $\gamma_{xy}(s, t) = \gamma_{yx}(t, s)$  and  $\rho_{xy}(s, t) = \rho_{yx}(t, s)$ ?

# News of today

## Definitions of

- a discrete time stochastic process (time series)
- the mean function
- the autocovariance function
- the autocorrelation function
- the cross-covariance function
- the cross-correlation function