## Univariate time series Introduction

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### The object of study

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### A time series is set of observations recorded in time order.

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# Many fields

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- history (e.g. industrial revolution),
- geography (e.g. migratory flows),
- demography (e.g. growth of a population),
- economics (e.g. rate of inflation),
- finance (e.g. stock price),
- meteorology (e.g. temperatures),
- medicine (e.g. electrocardiogram),
- epidemiology (e.g. spread of a disease),
- geophysics (e.g. earthquakes),
- communication (e.g. digital television),
- energy (e.g. load curve, wind and solar generation),

Examples

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## Some general questions

Forecast and/or explain ?

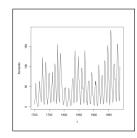


Figure: Sunspot number from 1790 to 1970

- Forecast interval.
- Cost of the forecasting error.
- Agreggate experts ?
- Univariate or multivariate time series ?



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# History of times series analysis

1. Graphic period

From 10th century (earlier ?), with astronomy:

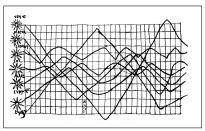


Figure: A.T. Macrobius, 10th century [4]

### 2. Deterministic period

From 18th century, with frequency analysis (Fourier, Stokes, Schuster) and trend-seasonality decomposition (Pearson).

3. Probabilistic period From 20th century (Yule, Cramer, Wold, Kolmogorov). The universe of time series

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### Music score



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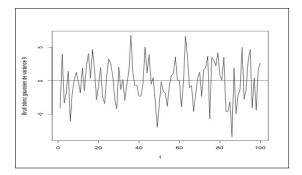
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Figure: French song 18th century ( Archives dpartementales du Pas-de-Calais)

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### White noise



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Figure: Gaussian noise with variance 9 (n=100)

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## USA population

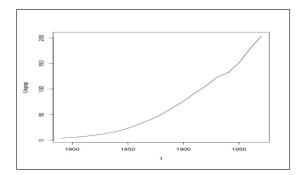


Figure: USA population from 1790 to 1990

### time series

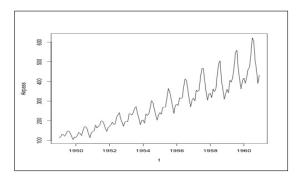
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## Airline passengers



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Figure: International air passengers from january 1960 to december 1971

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# Airline passengers (logarithm)

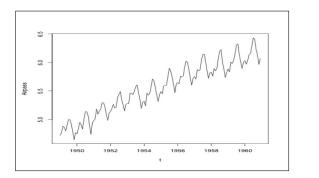


Figure: Logarithm of the international air passengers from january 1960 to december 1971

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## Australian beer production

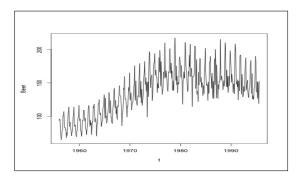


Figure: Australian beer production from january 1956 to february 1991

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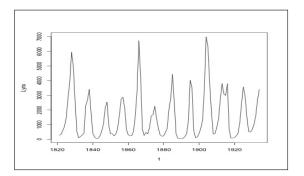
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## Numbers of annual lynx trappings in Canada



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Figure: Numbers of annual lynx trappings in Canada from 1821 to 1934

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### Course aims

• understand the problematic of time dependent data

- (stationarity),
- use simple signal processing tools (periodogram),
- be able to use a linear modeling on time series,
- ▶ and forecast.

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### References

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