

# **The R Project and Applied Statistics**

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5. LİNX VE ÖZGÜR YAZILIM ŞENLİĞİ

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# Before we begin. . .

What are we going to present?

**This presentation has two parts.**

- I. Some statistical background, together with several applications, without a focus on the command structure of R.
- II. An applied part, including a brief introduction to R and the R programming environment — in a live session!

# 1. Statistics and R

Statistics is the science of reasoning with numbers.

Statistics is concerned with

- detecting the structure in data sets.
- facilitating the communication between people.
- making well-founded decisions.
- forecasting the future.
- determining what (numerical) information is needed to solve a given problem.

# 1. Statistics and R

- Although some techniques can be done using paper and pencil, statistics is a hi-tech science: It needs powerful software to be effective.
- We recommend: R. Please visit:

[www.R-project.org](http://www.R-project.org)

- R is a language and environment for statistical computing and graphics. It is a GNU project with contributors from all over the world.

# 1. Statistics and R

## Advantages of R:

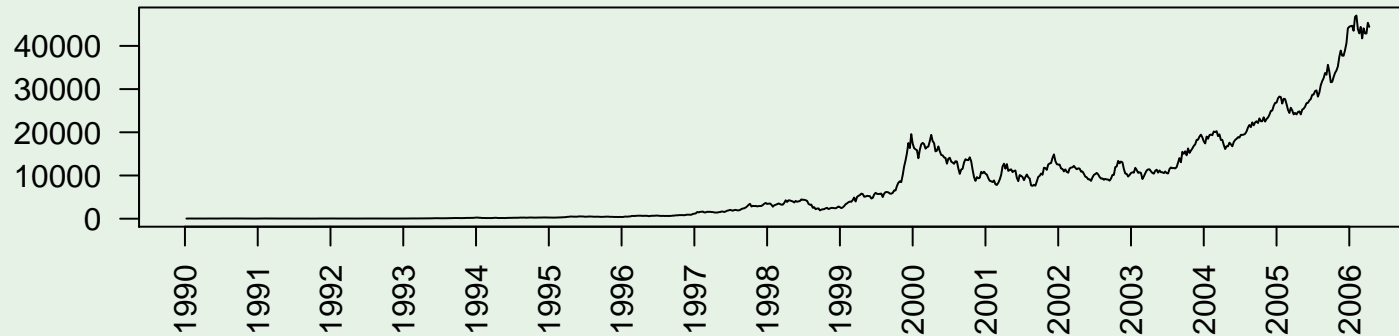
- extremely powerful, very professional
- constantly new functionality added
- GNU, open-source
- fairly easy to contribute
- support from user community

## Disadvantages of R:

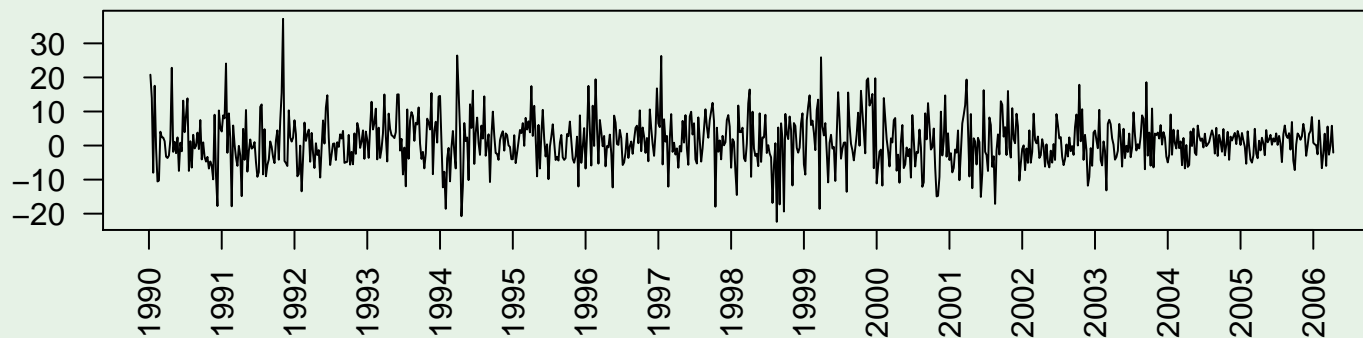
- no guarantee it works, but. . .
- no GUI, but. . .

## 2. An Elementary Example

**IMKB 100**

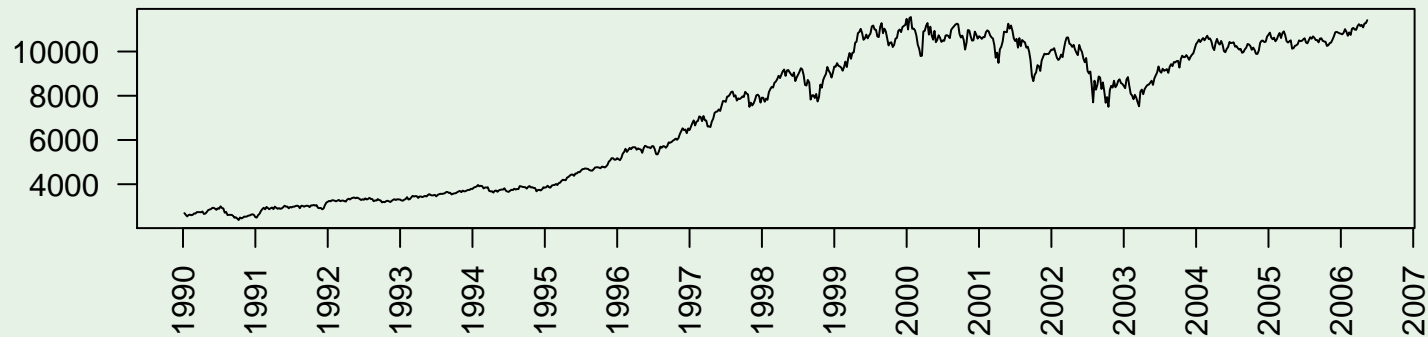


**Weekly returns on IMKB 100 (percent)**

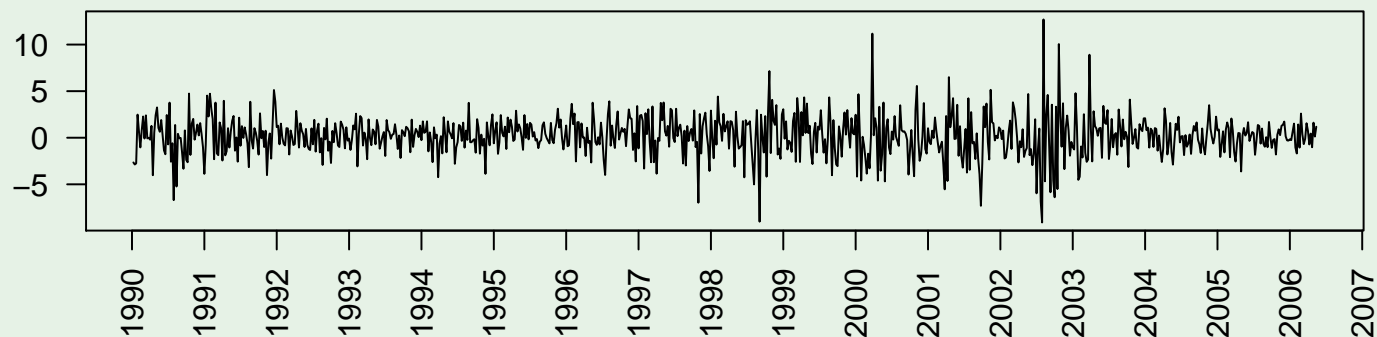


## 2. An Elementary Example (ctd.)

**Dow-Jones**

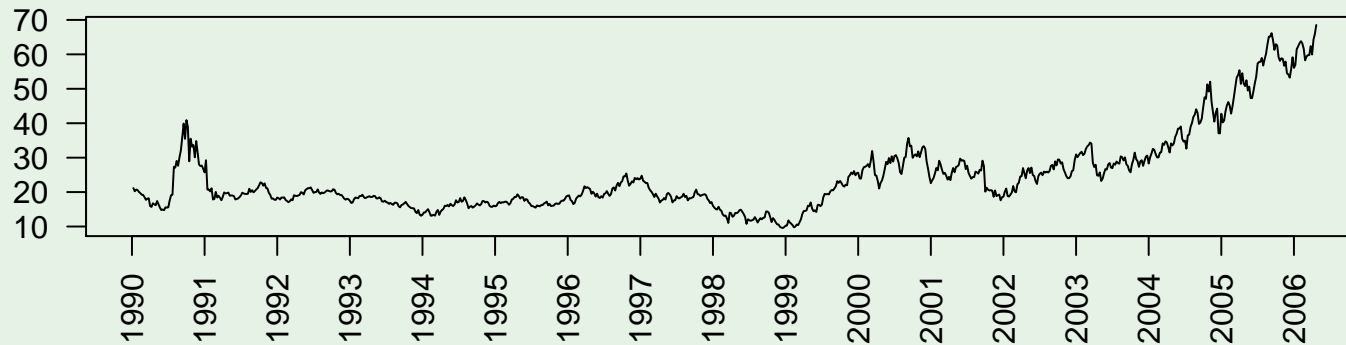


**Weekly returns on Dow-Jones (percent)**

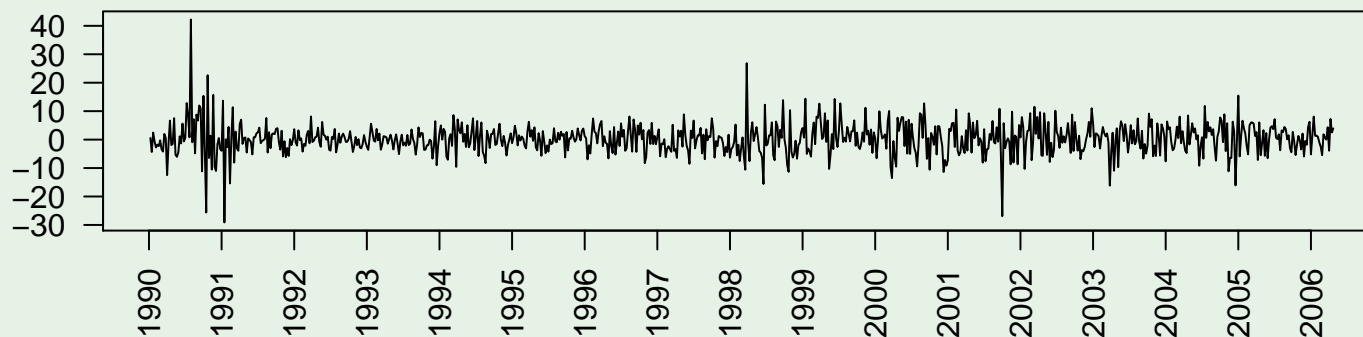


## 2. An Elementary Example (ctd.)

**Brent Crude Oil**



**Weekly returns on Brent (percent)**





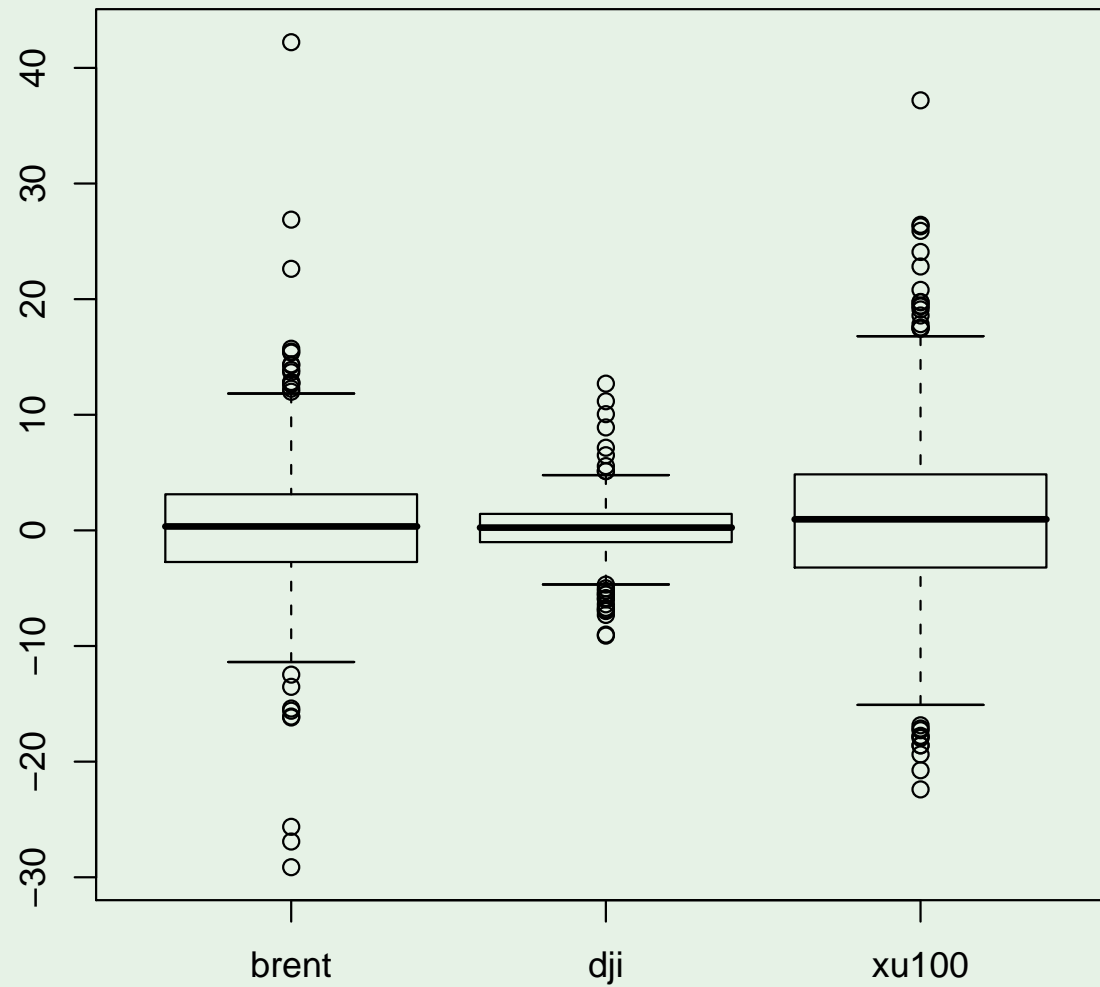
## 2. An Elementary Example (ctd.)

	xu100	dji	brent
first day	1990-01-09	1990-01-09	1990-01-09
last day	2006-05-02	2006-05-02	2006-04-11
observations	831	852	849
NAs	21	0	0
mean	1.16456	0.18826	0.28539
std error	0.24054	0.07570	0.19264
var	50.09061	4.73443	29.51176
std deviation	7.07747	2.17587	5.43247
skewness	0.35404	0.10626	0.32862
std error	0.17780	0.27521	0.52050
kurtosis	1.60865	3.36157	6.80703
std error	0.56330	0.87830	2.77051

## 2. An Elementary Example (ctd.)

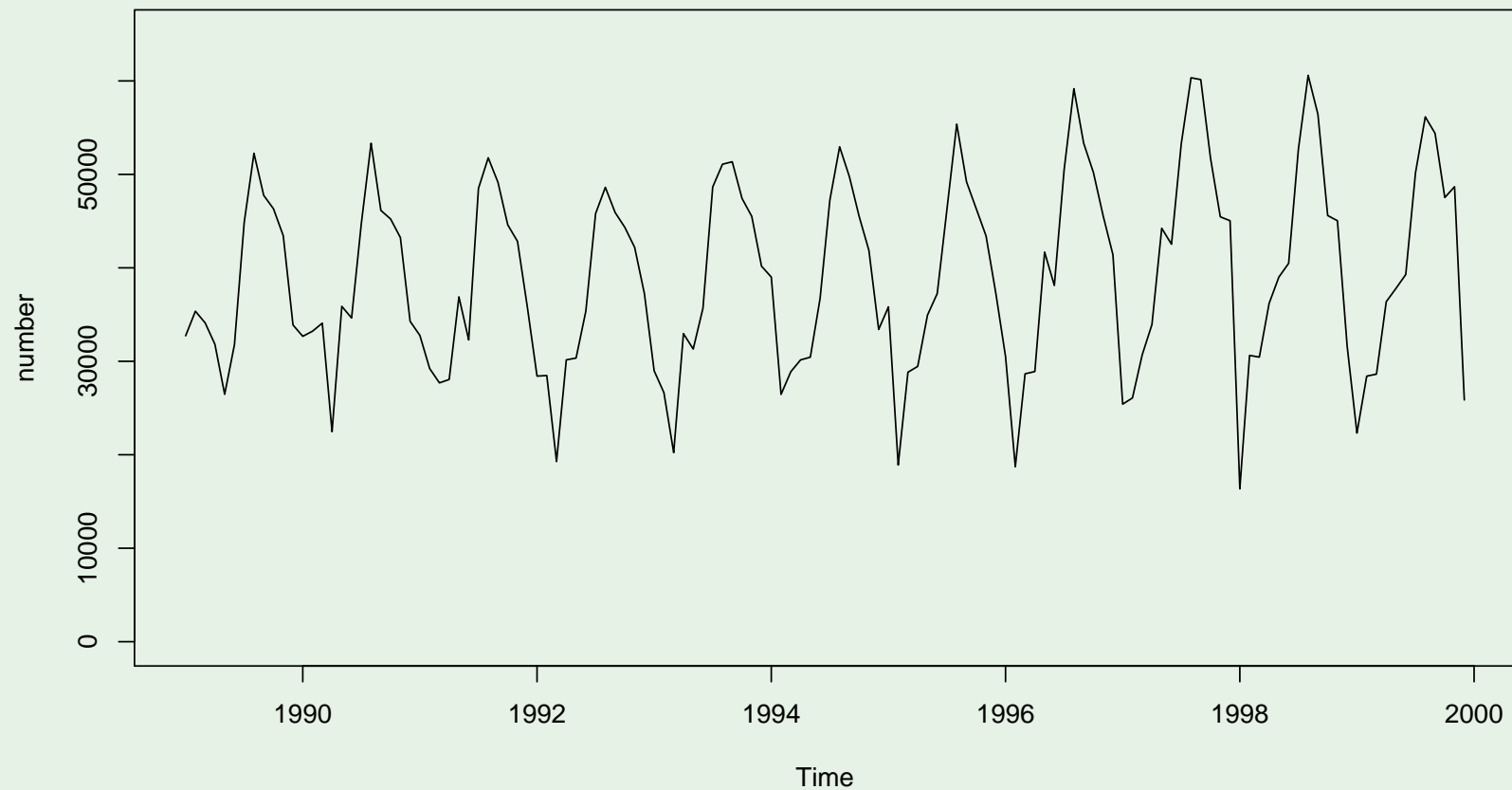
	xu100	dji	brent
min	−22.39859	−9.09702	−29.12821
lower quartile	−3.21090	−1.01842	−2.70595
median	0.95726	0.23886	0.31192
upper quartile	4.85772	1.42617	3.11213
max	37.19807	12.69361	42.22569
week of min	1998-09-01	2002-07-23	1991-01-22
week of max	1991-11-26	2002-07-30	1990-08-07

## 2. An Elementary Example (ctd.)

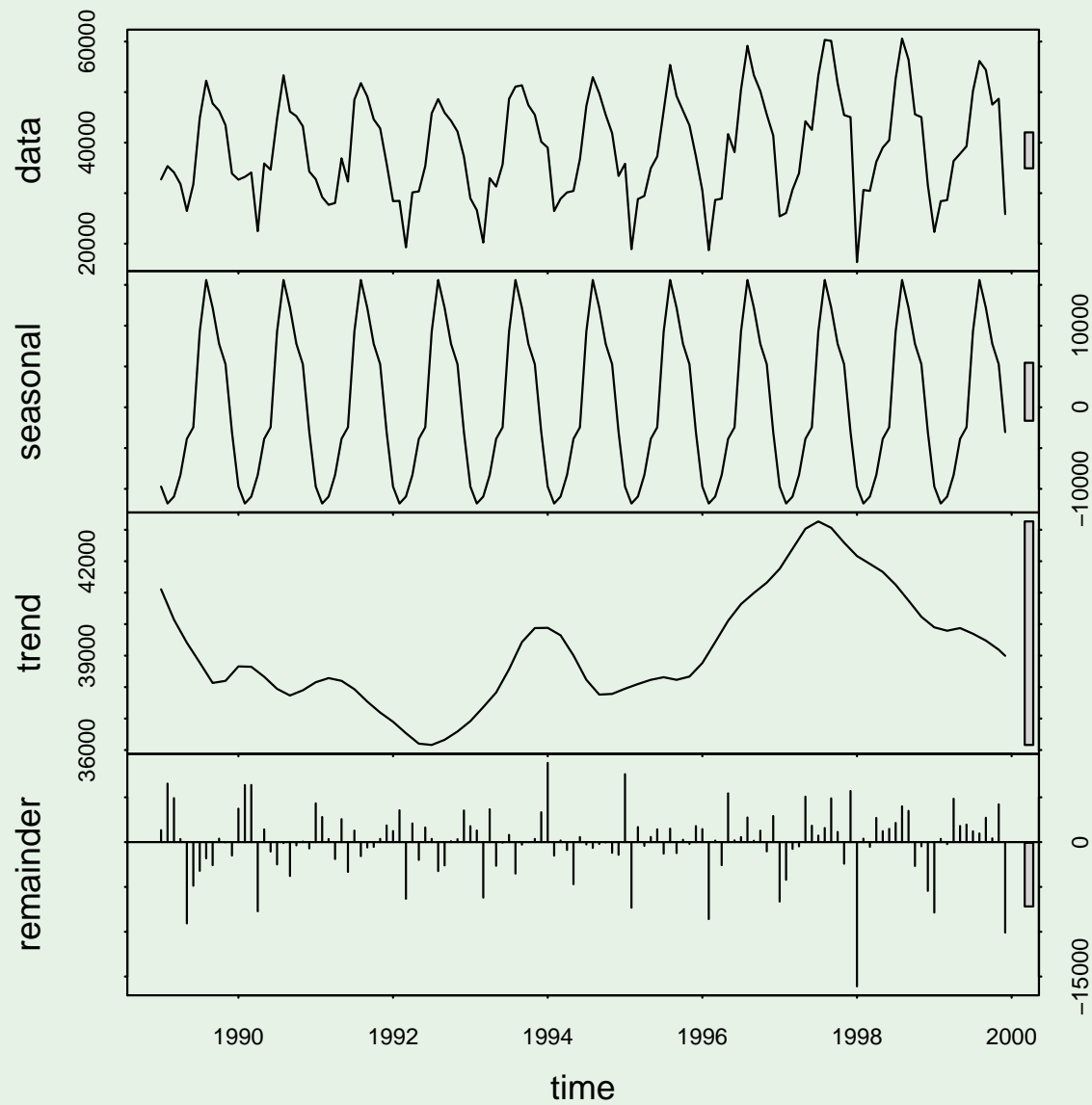


# 3. Marriages in Turkey

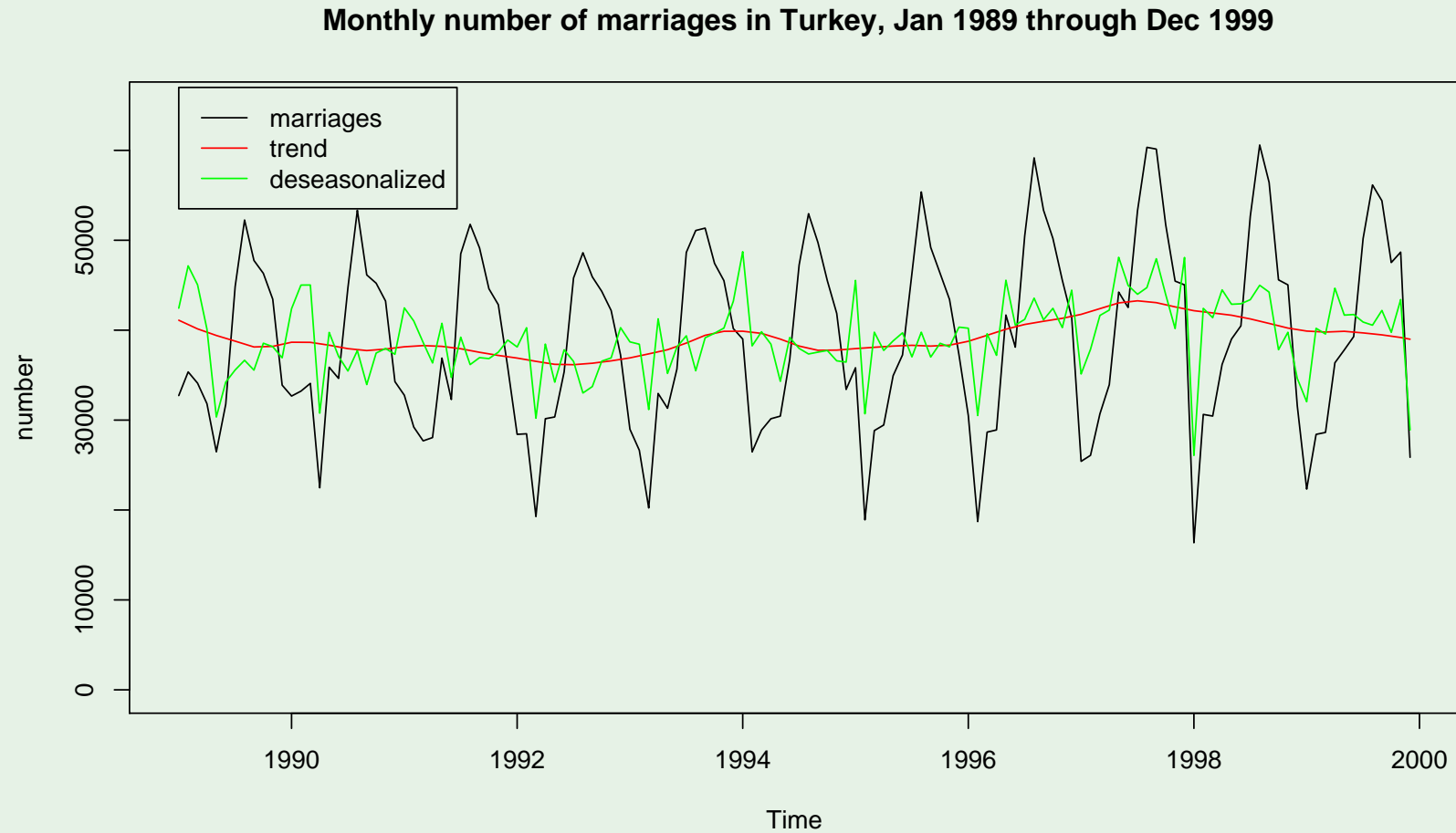
Monthly number of marriages in Turkey, Jan 1989 through Dec 1999



### 3. Marriages in Turkey: stl analysis



### 3. Marriages in Turkey (ctd.)



## 4. Stochastic Models Behind the Observations

- A stochastic model is a mathematical model which describes a chance setup.
- The paradigm of inductive statistics is:

Regard the observed data  
as the outcome of a chance setup.

This means:

- We have to identify a suitable stochastic model.
- We have to “learn” about its parameters.

## 5. Time Series Analysis: A GARCH Example

The simplest GARCH model is:

$$\epsilon_t = \nu_t \cdot \sqrt{h_t}, \quad h_t = \alpha_0 + \alpha_1 \epsilon_{t-1}^2 + \beta h_{t-1}$$

(Engle 1982; Bollerslev 1986)

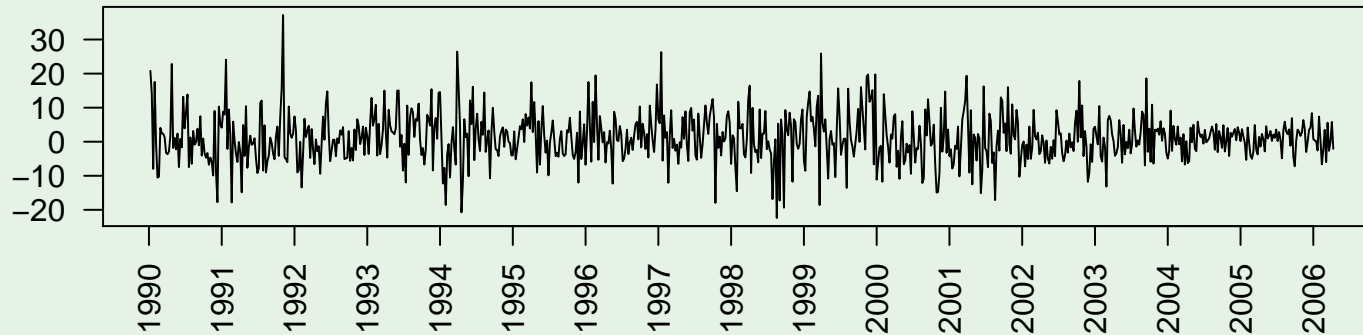
For a series of weekly returns on İMKB 100:

$$h_t = \underset{(0.955)}{2.713} + \underset{(0.020)}{0.137} \epsilon_{t-1}^2 + \underset{(0.024)}{0.819} h_{t-1}$$

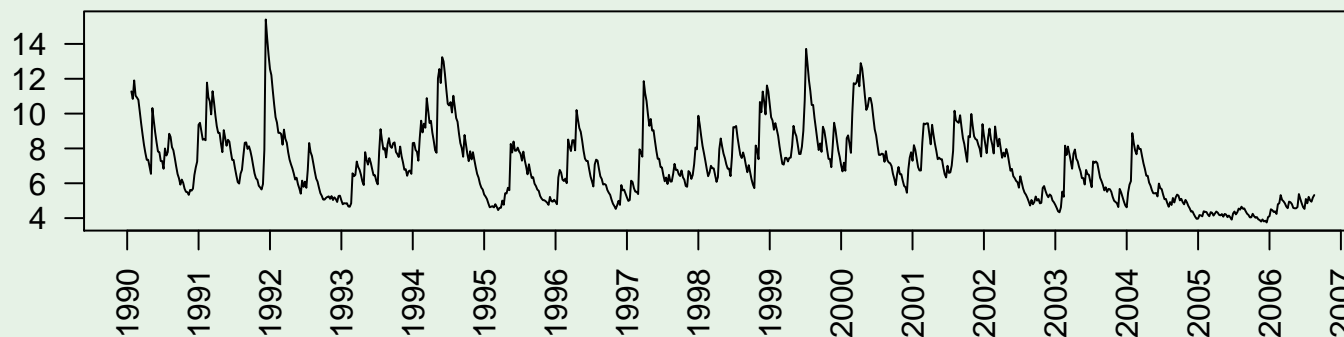


## 5. A GARCH Example (ctd.)

**Weekly returns on IMKB 100 (percent)**



**Weekly volatility of IMKB 100**



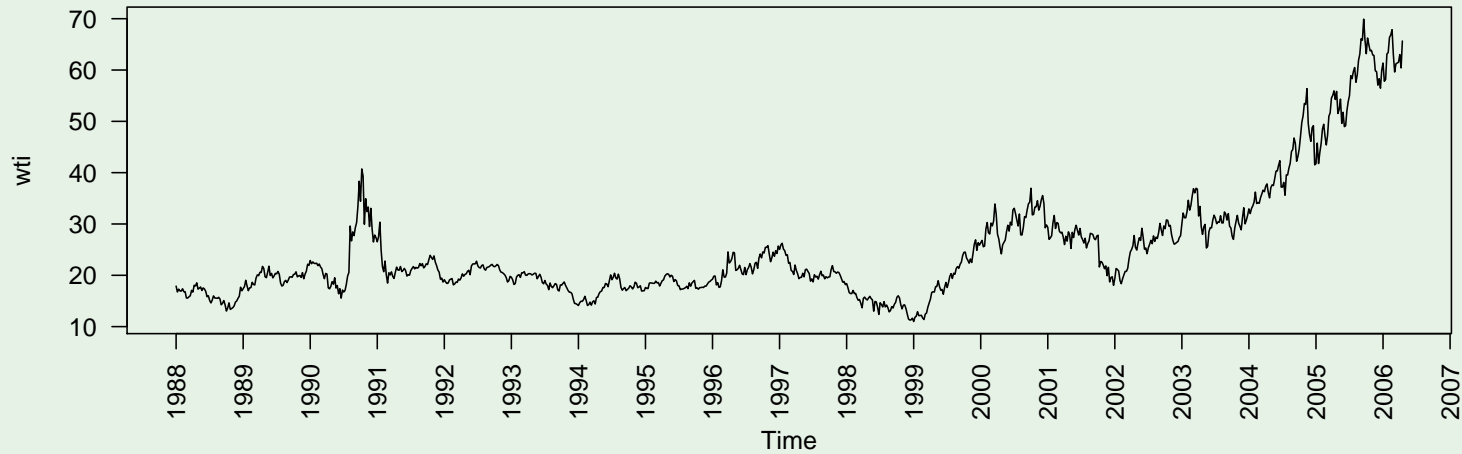
## 6. Modeling Volatility Spillovers

**Example:** Volatility spillovers between crude oil and the stock market.

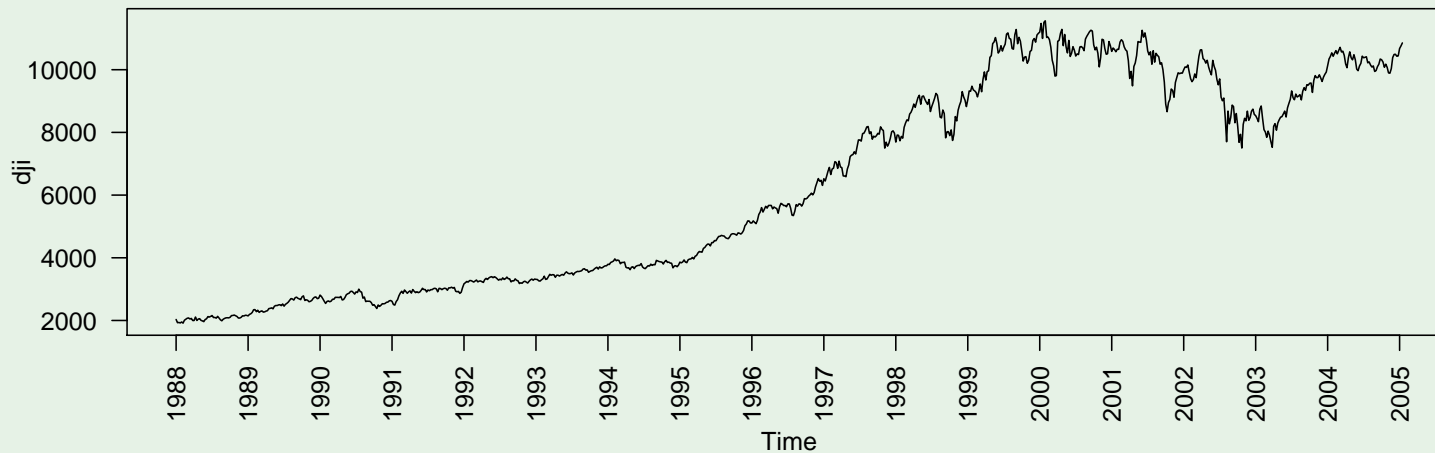
- Wild fluctuations in the price of crude oil will somehow affect the stock market.
- Often we observe periods of high variability in *both* time series.
- Sophisticated models are needed to investigate this effect.

## 6. Modeling Volatility Spillovers (ctd.)

crude oil price (wti, usd/barrel)

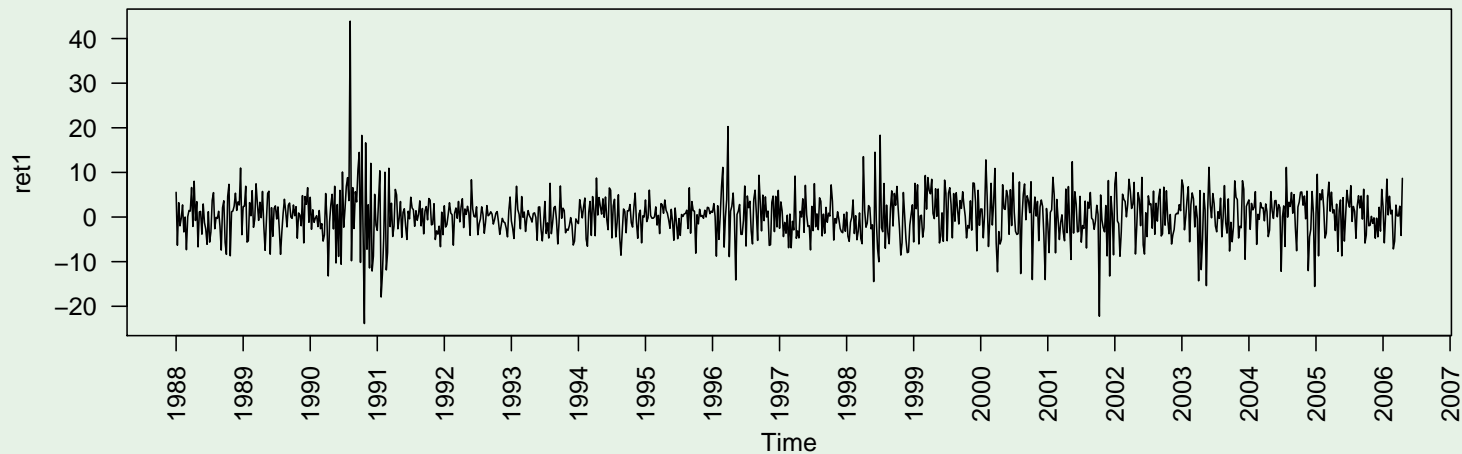


Dow-Jones

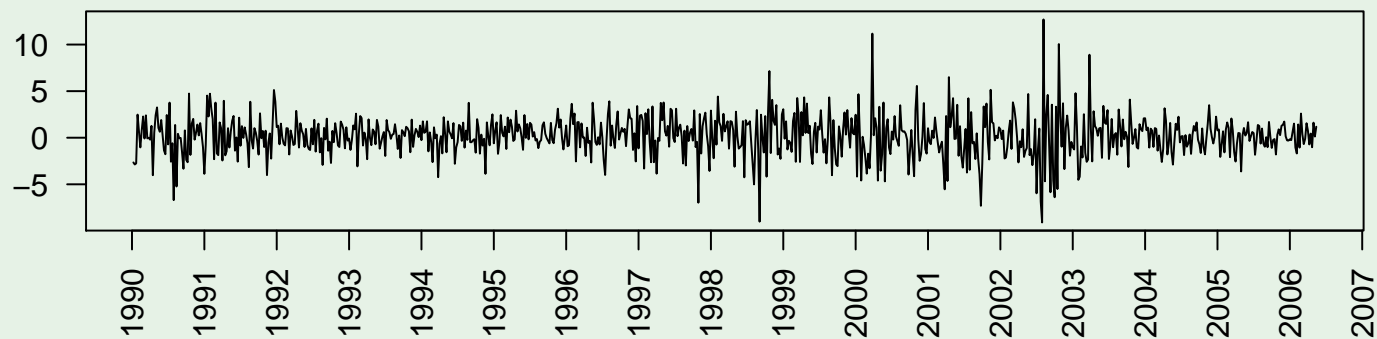


## 6. Modeling Volatility Spillovers (ctd.)

Weekly changes in crude oil price (percent)



Weekly returns on Dow-Jones (percent)



## 6. Modeling Volatility Spillovers (ctd.)

To investigate volatility spillovers, we need some kind of a bivariate GARCH model:

$$\epsilon_t = H_t^{1/2} \cdot \nu_t$$

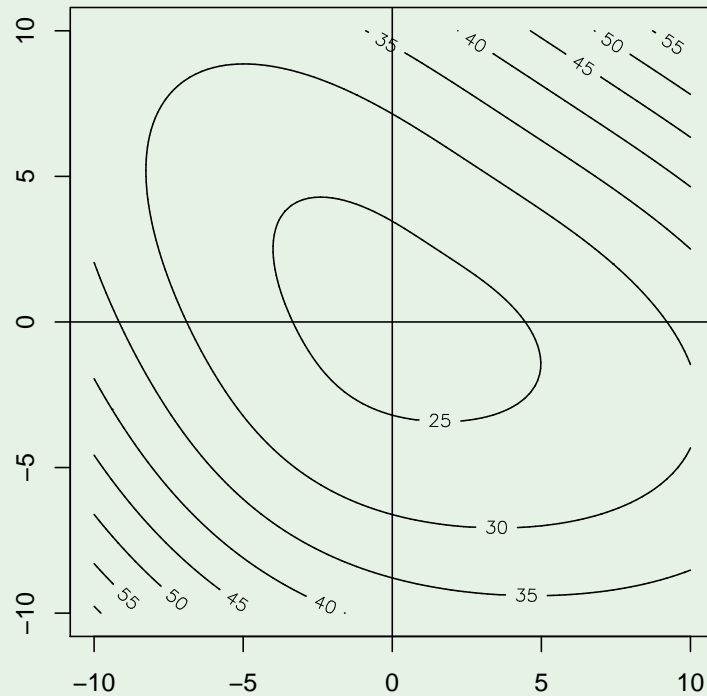
The conditional covariance matrix is defined as

$$\begin{aligned} H_t = & C'C + A'\epsilon_{t-1}\epsilon'_{t-1}A + B'H_{t-1}B \\ & + S_w(\epsilon_{t-1}) \cdot \Gamma'\epsilon_{t-1}\epsilon'_{t-1}\Gamma \end{aligned}$$

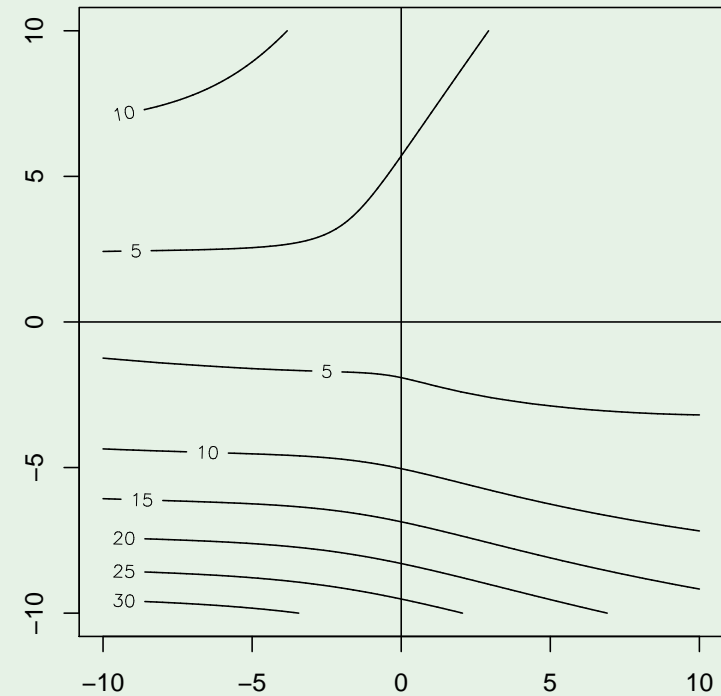
This is implemented in the R-package mgarchBEKK  
(Harald Schmidbauer & Vehbi Sinan Tunalioglu)

## 6. Modeling Volatility Spillovers (ctd.)

news impact on variance of crude oil returns



news impact on variance of dji returns



## 7. The R Project and Linux

- R harmonizes very well with  $\text{\LaTeX}$ .
- The R project and further applications. . .