

# Modelling point's position time series in the light of cointegration

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# Data

## GPS observation time series

Location: Permanent station Borowiec (Poland)

Part of: EUREF Permanent Network

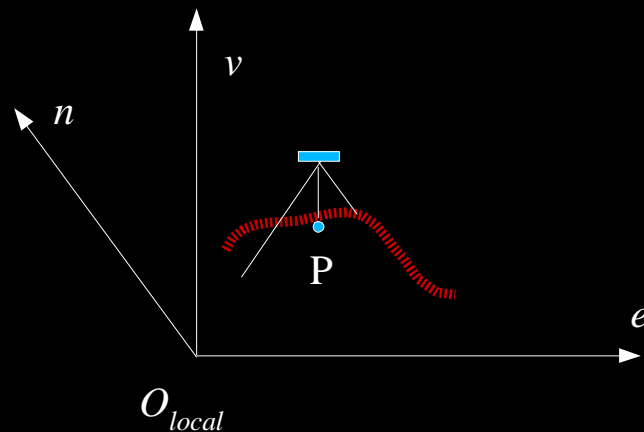
Purpose: Regular monitoring of recent kinematics of the Earth's crust (among others)

Period: 2001-2002

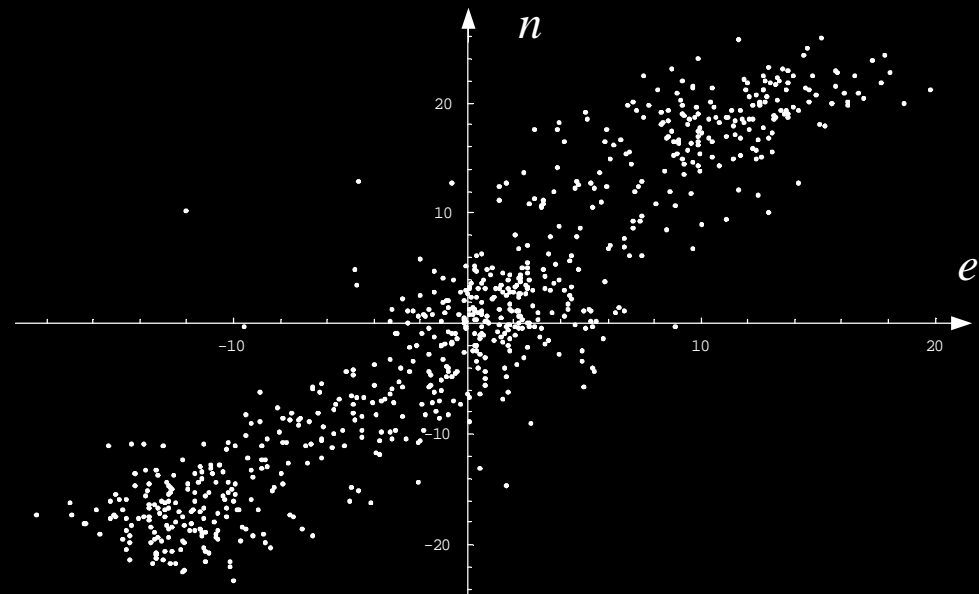
Time points: 730 daily average values

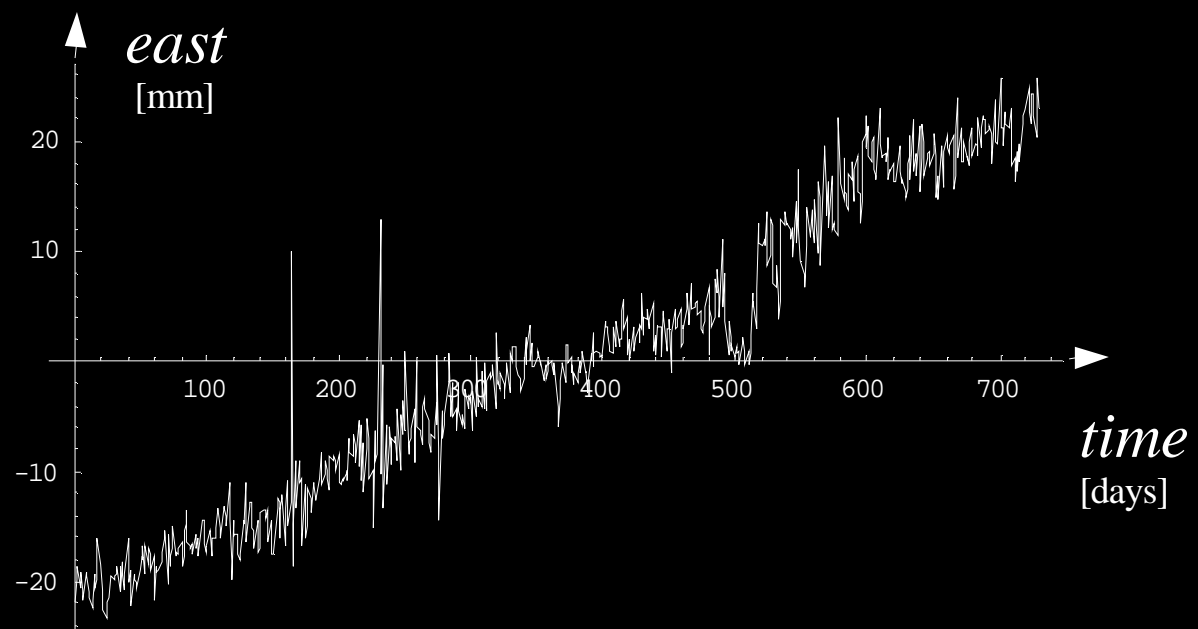
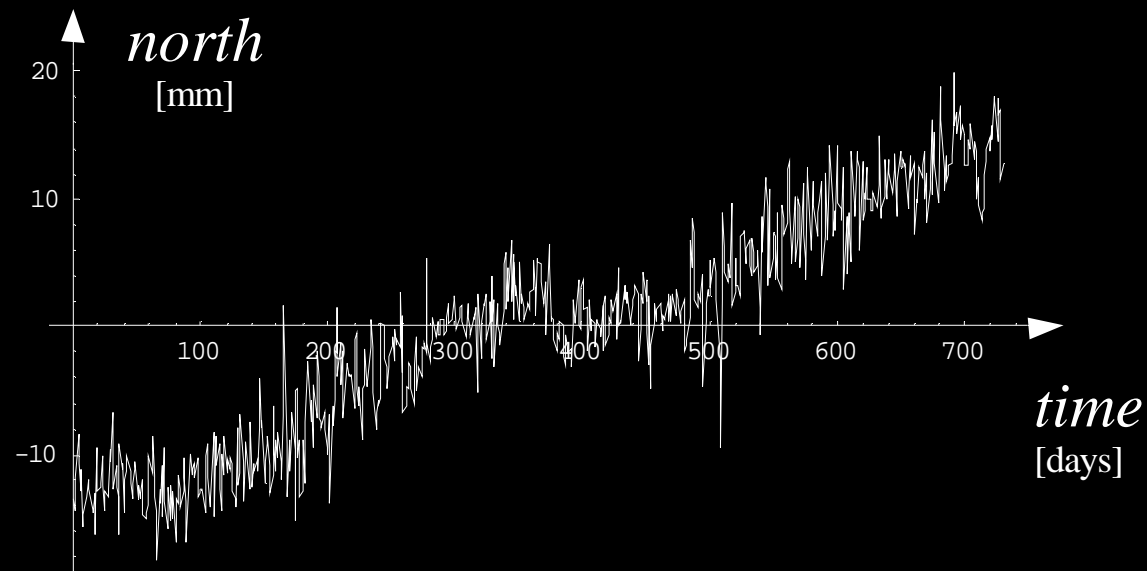
Coordinate system: Horizontal ( $n$   $e$   $v$ )

3D - scheme:



2D – horizontal plane:





Note:

The obvious linear trend is the consequence of a long-term drift of the Eurasian tectonic plate.

# Processing

3 ways to treat our data:

- Ø Process it separately as two independent univariate time series.
- Ø Accept the interrelationship and use the multivariate modeling methods.
- Ø Test for cointegration and transform the data with respect to common trend.

The goal of our experiment:

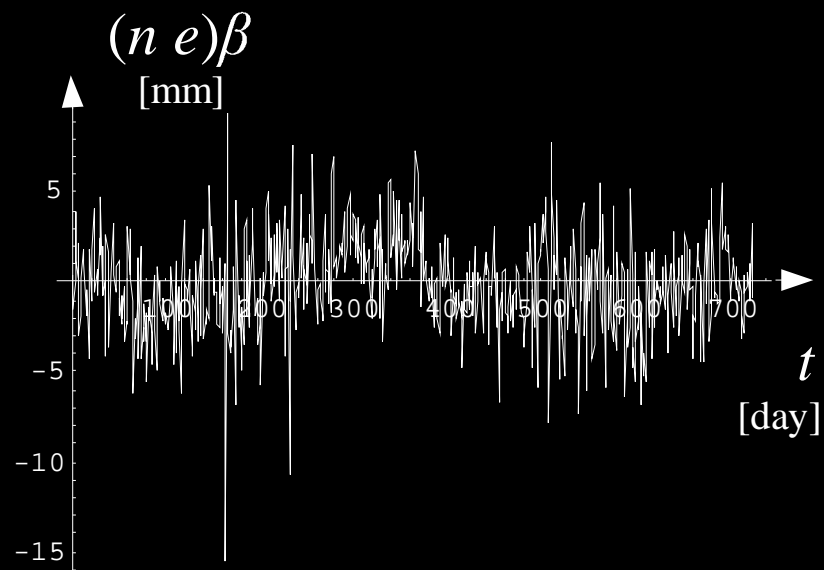
Compare the three approaches according to forecast accuracy and show the benefit of the cointegration theory.

# Cointegration

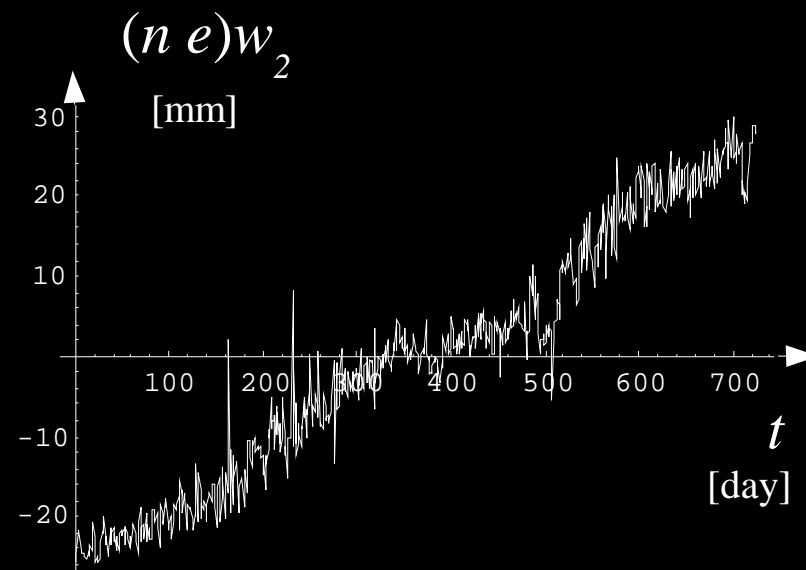
Two non-stationary  $I(1)$  time series are cointegrated, if one of their linear combinations is  $I(0)$  and hence stationary.  $I(k)$  denotes “integrated of  $k$ -th order”.

## Procedure:

- ü Testing for the presence of stochastic trend (against pure deterministic components)
  - § tests for unit roots (Dickey-Fuller)
  - § stationarity tests (Kwiatkowski)
- ü Testing for cointegration
  - § Engle-Granger two steps method
  - § Johansen's method
- ü Common stochastic trend estimate (Gonzalo-Granger)



Equilibrium (or long-run) relation between  $n$ ,  $e$ .



Common stochastic trend.

Note:

$b$  denotes cointegration parameters vector and  $w_2$  eigenvector pertaining to common trend direction.

# Geometric viewpoint

Looking for linear combination

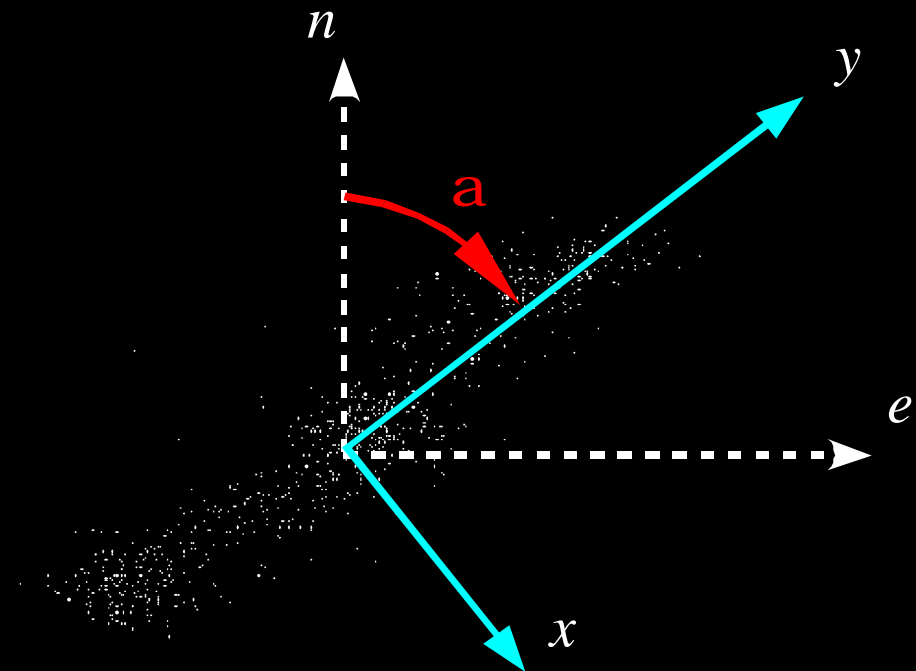
$$y = g_1 n + d_1 e$$

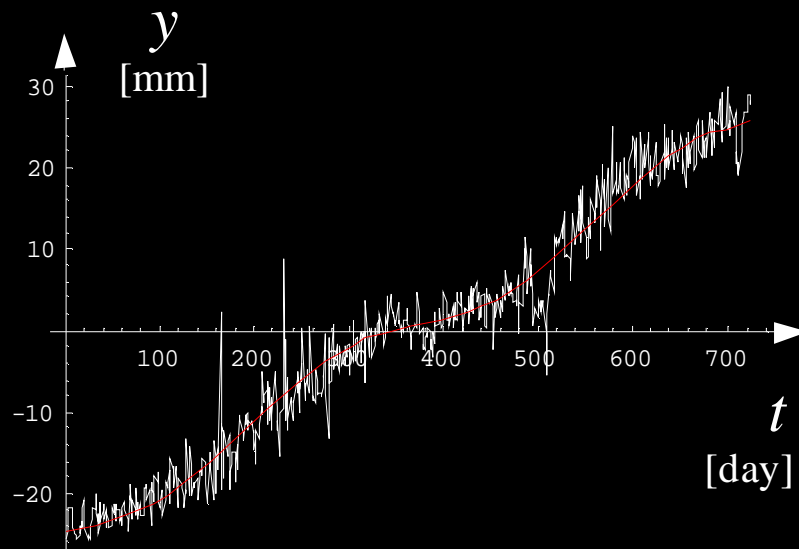
$$x = g_2 n + d_2 e$$

such that  $y$  represents a common trend direction and  $x$  a stationary trend-free variable, orthogonal to  $y$ , the problem is easily rewritable into familiar transformation

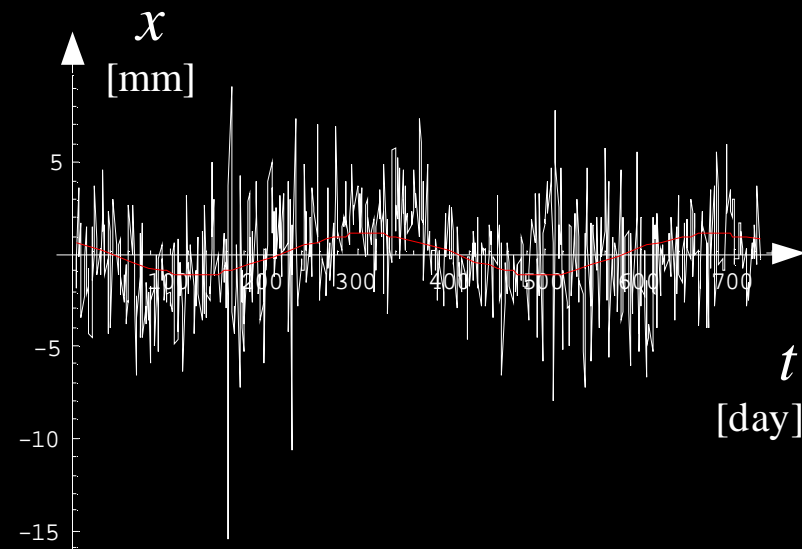
$$\begin{bmatrix} y \\ x \end{bmatrix} = \begin{bmatrix} \cos a & \sin a \\ -\sin a & \cos a \end{bmatrix} \begin{bmatrix} n \\ e \end{bmatrix}$$

The angle  $a$  can be determined from analysis of deterministic (or stochastic) trend.





Common trend direction variable containing linear trend and seasonality.



Trend-free variable contains only seasonal component.

### Final steps:

- Apply Box-Jenkins methodology.
- Transform the whole model back to north-east system.
- Forecast 5 out-of-sample values.
- Compute mean square (MSE) and mean percentage (MPE) error from model prediction and known real values.
- Compare errors from all of the methods.



# Results

| variable | trend<br>[mm/year] | seasonality    |               |
|----------|--------------------|----------------|---------------|
|          |                    | amplitude [mm] | period [days] |
| $n$      | 13.2               | 2.2            | 365           |
| $e$      | 21.5               | 1.6            |               |
| $y$      | 25.2               | 2.5            |               |
| $x$      | 0                  | 1.1            |               |

## Deterministic model parameters

| method                                    | variable | order<br>$p$ | mse<br>[ mm <sup>2</sup> ] | mpe<br>[ % ] |
|---|----------|--------------|----------------------------|--------------|
| 1.)<br>independent univariate time series | $n$      | 1            | 7.40                       | 5.08         |
|   | $e$      | 4            | 3.70                       | 2.88         |
| 2.)<br>multivariate time series           | $n$      | 2            | 8.13                       | 5.44         |
|   | $e$      | 2            | 5.06                       | 5.13         |
| 3.)<br>respecting common trend            | $n$      | 2 (y)        | <b>5.90</b>                | <b>4.04</b>  |
|   | $e$      | 4 (x)        | <b>4.10</b>                | <b>2.49</b>  |

## Forecast measures of model effectivity

*Thank you*  
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