

# Structural Breaks in Inflation Dynamics within the European Monetary Union

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# Overview

- Introduction
- Data
- Model
- Example
- Results
- Conclusion

# Introduction

- Did EMU change inflation dynamics ?
- Economic Reasons
  - Former COMECON countries
  - Ex-Yugoslavia
  - Southern European countries
  - Central European countries

# Data

- 21 Monthly HICP series, unadjusted
- Source: OECD Statistics
- 3 groups
  - EURO countries
  - EU members withouth ERM II
  - Others

# Model

- Actually some alternatives
  - ARIMA
  - GARCH
- Our model

# Generalized Logistic Distribution (GL)

For series  $y = 100 \cdot \log(HICP_t/HICP_{t-1})$  we assume a GL-distribution given by:

$$f(y|\theta, \sigma, \delta) = \frac{\frac{\delta}{\sigma} \cdot \exp^{-\frac{y-\theta}{\sigma}}}{(1 + \exp^{-\frac{y-\theta}{\sigma}})^{(\delta+1)}}$$

with location ( $\theta$ ), scale ( $\sigma$ ) and shape ( $\delta$ ).

Moments:

$$\begin{aligned} E(y) &= \theta + \sigma(\psi(\delta) - \psi(1)) \\ VAR(y) &= \sigma^2(\psi'(1) + \psi'(\delta)) \\ SKEW(y) &= \frac{\psi''(\delta) - \psi''(1)}{(\psi'(1) + \psi'(\delta))^{\frac{3}{2}}} \end{aligned}$$

# Framework

For the 3-dimensional parameter  $\phi = (\theta, \sigma, \delta)$  we test:

$$\begin{aligned} H_0 : \phi_i &= \phi_0 \ (i = 1, \dots, n) \\ \underset{\phi \in \Phi}{\operatorname{argmin}} \sum_{t=1}^n \log f(y_t | \phi) &= \hat{\phi}, \\ \sum_{t=1}^n s(y_t | \hat{\phi}) &= 0 \end{aligned}$$

To examine changes we employ the empirical scores  $s(y_t | \hat{\phi})$

# Scores

3 components,  $s() = (s_\theta, s_\sigma, s_\delta)$ :

$$\begin{aligned}s_\theta(y|\theta, \sigma, \delta) &= \frac{\delta \log f(y|\theta, \sigma, \delta)}{\delta \theta} \\ &= \frac{1}{\sigma} - (\delta + 1) \cdot \frac{\frac{1}{\sigma} \exp^{-\frac{y-\theta}{\sigma}}}{(1 + \exp^{-\frac{y-\theta}{\sigma}})}\end{aligned}$$

$$\begin{aligned}s_\sigma(y|\theta, \sigma, \delta) &= \frac{\delta \log f(y|\theta, \sigma, \delta)}{\delta \sigma} \\ &= -\frac{1}{\sigma} + \frac{1}{\sigma^2}(y - \theta) - (\delta + 1) \\ &\quad \times \frac{\frac{1}{\sigma^2}(y - \theta) \exp^{-\frac{y-\theta}{\sigma}}}{(1 + \exp^{-\frac{y-\theta}{\sigma}})}\end{aligned}$$

$$\begin{aligned}s_\delta(y|\theta, \sigma, \delta) &= \frac{\delta \log f(y|\theta, \sigma, \delta)}{\delta \delta} \\ &= \frac{1}{\delta} - \log(1 + \exp^{-\frac{y-\theta}{\sigma}})\end{aligned}$$



# Empirical Fluctuation Process

The empirical fluctuation process  $efp(\cdot)$  is given by:

$$efp(t) = \hat{V}^{-1/2} n^{-1/2} \sum_{i=1}^{\lfloor nt \rfloor} s(y_i | \hat{\theta}, \hat{\sigma}, \hat{\delta}) \quad (0 \leq t \leq 1),$$
$$efp(\cdot) \xrightarrow{d} W^0(\cdot)$$

We can employ a Functional Central Limit Theorem (FCLT) on  $efp(\cdot)$

# Test

We use Supremum of LM statistics:

$$\sup_{t \in [0.1, 0.9]} \frac{\|efp(t)\|_2^2}{t(1-t)}$$

p-values can be computed from:

$$\sup_{t \in [0.1, 0.9]} \frac{\|W^0(t)\|_2^2}{t(1-t)}$$

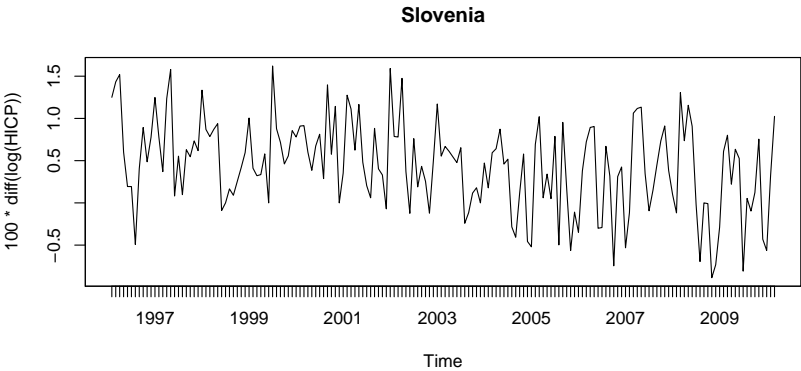
# Breakpoint Estimation

- If instability detected, estimate  $B \in [1, 6]$  breakpoints  $\tau_1, \dots, \tau_B$  via maximization of full segmented likelihood:

$$\sum_{b=1}^B \sum_{t=\tau_{b-1}+1}^{\tau_b} \loglik(y_t | \theta^{(b)}, \sigma^{(b)}, \delta^{(b)})$$

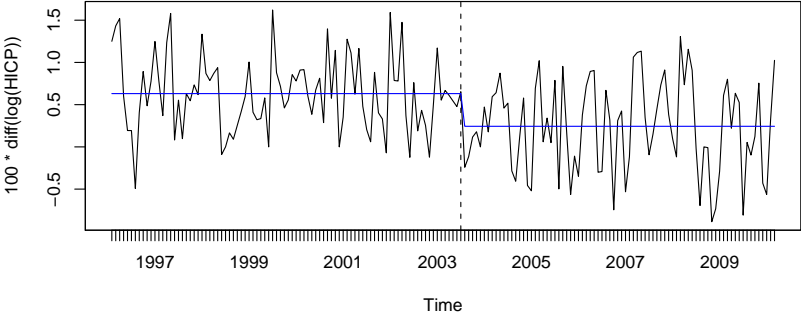
- Estimate models with  $B=1, \dots, 6$  breakpoints; select via modified BIC

# Slovenia

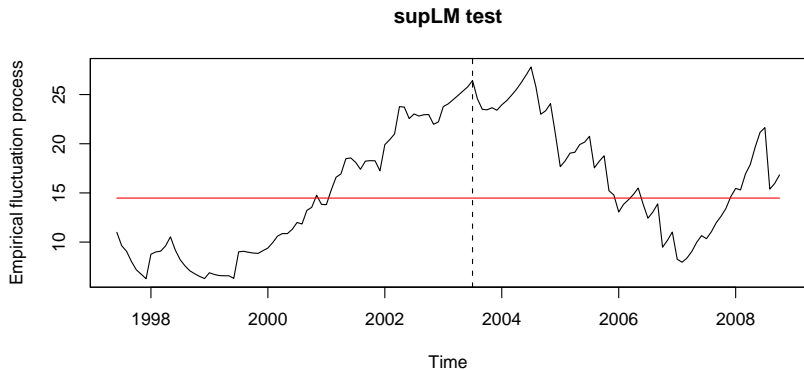


# Slovenia

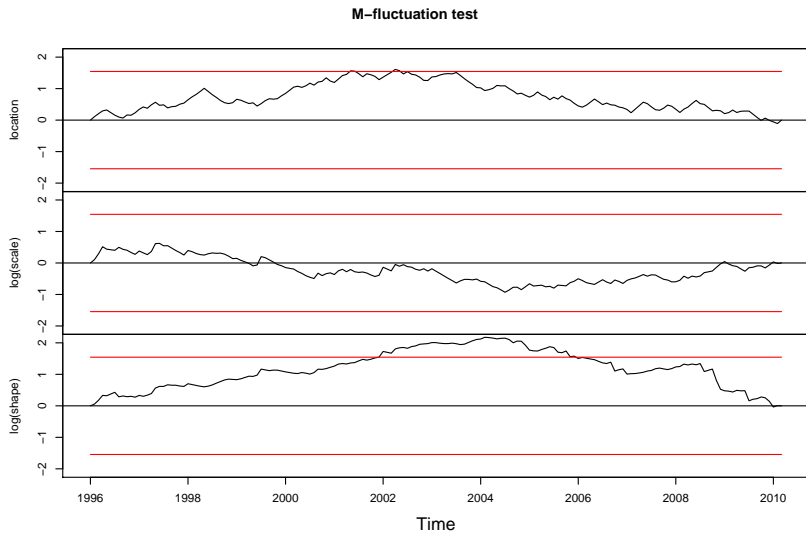
Series with Fitted Mean



# Test

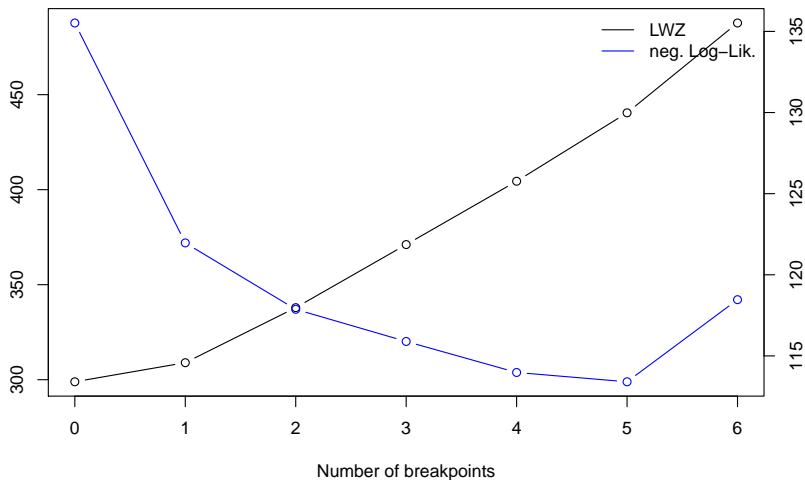


# Moment changes



# Breakpoint Selection

LWZ and Negative Log-Likelihood





# Slovenia–Fitted Model

## Economic Interpretation:

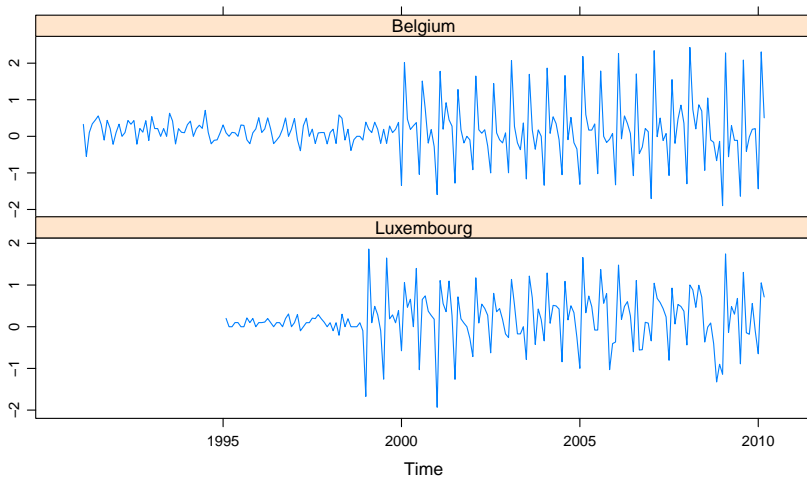
- had to reach Maastricht criteria
  - low inflation rate ( $< 1.5$  percentage points higher than average of 3 best performing)
  - deficit no higher than 3% of GDP
  - gross government debt  $< 60\%$  of GDP
  - no devaluation in ERM II
- most reforms regarding financial sector introduced in 2003
- strong contraction in money supply (M1) starting in 2003
- from 2003 onwards much lower mean, but higher variance
- entered ERM II in June 2004; declared ready to join by ECB in May 2006

# Results

Some countries exhibit very similar patterns

- Eastern countries: Czech Republic, Estonia, Hungary, Poland, Slovakia and Slovenia
- Belgium and Luxembourg
- Italy and Spain
- Ireland
- No change countries: Finland, Greece, Netherlands
- Further results

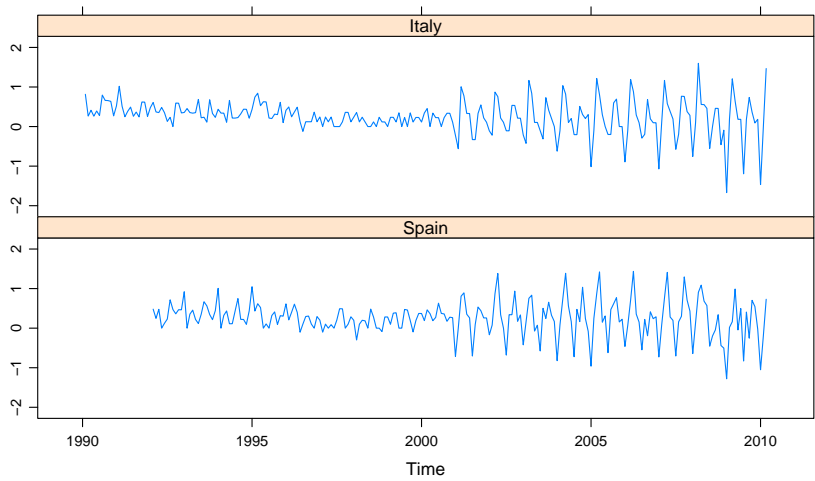
# Belgium and Luxembourg



# Belgium and Luxembourg

| Country    | Segment           | Mean  | Variance | Skewness | ERM      | ERM II | EURO     |
|------------|-------------------|-------|----------|----------|----------|--------|----------|
| Belgium    | Feb 1991–Dez 1999 | 0.146 | 0.064    | −0.037   | Mär 1979 | –      | Jän 1999 |
|            | Jän 2000–Mär 2010 | 0.177 | 0.954    | 0.504    |          |        |          |
| Luxembourg | Feb 1995–Dez 1998 | 0.088 | 0.013    | 0.261    | Mär 1979 | –      | Jän 1999 |
|            | Jän 1999–Mär 2010 | 0.224 | 0.531    | −0.484   |          |        |          |

# Italy and Spain

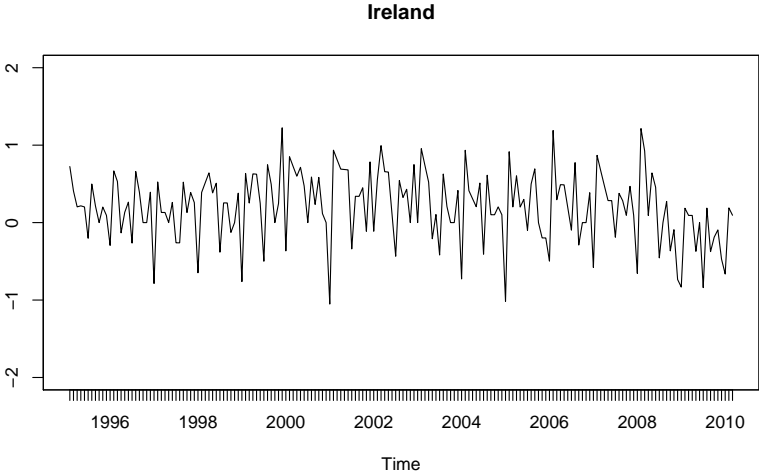


# Italy and Spain

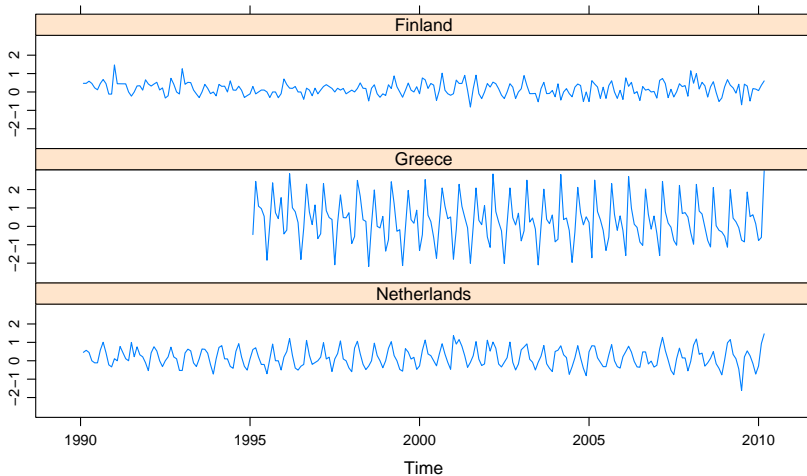
| Country | Segment           | Mean  | Variance | Skewness | ERM      | ERM II | EURO     |
|---------|-------------------|-------|----------|----------|----------|--------|----------|
| Italy   | Feb 1990–Mai 1996 | 0.414 | 0.041    | 0.963    | Mär 1979 | –      | Jän 1999 |
|         | Jun 1996–Dez 2000 | 0.168 | 0.020    | 0.726    |          |        |          |
|         | Jän 2001–Mär 2010 | 0.182 | 0.321    | –0.261   |          |        |          |
| Spain   | Feb 1992–Mai 1996 | 0.372 | 0.070    | 1.139    | Jun 1986 | –      | Jän 1999 |
|         | Jun 1996–Dez 2000 | 0.200 | 0.040    | 0.019    |          |        |          |
|         | Jän 2001–Mär 2010 | 0.223 | 0.342    | –0.362   |          |        |          |

# Ireland

| Country | Segment           | Mean   | Variance | Skewness | ERM      | ERM II | EURO     |
|---------|-------------------|--------|----------|----------|----------|--------|----------|
| Ireland | Feb 1995–Mär 2008 | 0.255  | 0.205    | −0.696   | Mär 1979 | –      | Jän 1999 |
|         | Apr 2008–Mär 2010 | −0.131 | 0.184    | −0.995   |          |        |          |



# No change countries





# No change countries

| Country     | Segment           | Mean  | Variance | Skewness | ERM      | ERM II   | EURO     |
|-------------|-------------------|-------|----------|----------|----------|----------|----------|
| Greece      | Feb 1995–Mär 2010 | 0.323 | 1.480    | 0.431    | Mär 1998 | Jän 1999 | Jän 2001 |
| Netherlands | Feb 1990–Mär 2010 | 0.185 | 0.293    | 0.598    | Mär 1979 | –        | Jän 1999 |
| Finland     | Feb 1990–Mär 2010 | 0.165 | 0.132    | 0.280    | Okt 1996 | –        | Jän 1999 |

# Conclusion

- Stabilizing Effect of EURO
- Overall lowering in mean inflation rates
- Overall increase in volatility

# HICP

First step: local sub-index of a specific price collected item  $R_{iy}^t$ :

$$R_{iy}^t = \frac{(\prod_{j=1}^n p_{iyj}^t)^{1/n}}{(\prod_{j=1}^n p_{iyj}^0)^{1/n}}$$

Second step: sub-index for whole country  $R_i^t$ :

$$R_i^t = \sum_{y=1}^m R_{iy}^t G_y$$

$$R_h^{t,T} = R_h^{12,T-1} \left[ \frac{\sum_{i=1}^q w_i^T R_i^t / R_i^{12,T-1}}{\sum_{i=1}^q w_i^T} \right]$$

Third step: weighted average of all included individual subindices:

$$HICP_t = \sum_{i=1}^n \gamma_i R_h^{t,T}$$