



University of  
Zurich<sup>UZH</sup>

---

# Day-Ahead Workshop on Financial Regulation

University of Zurich  
October 13-14, 2021

## Estimating the Market Power of Banks in the EU: A Stochastic Frontier Approach with Environmental Variables

*Cristina Ortega-González (cristinaog@uma.es)  
University of Málaga*

# Estimating the Market Power of Banks in the EU: A Stochastic Frontier Approach with Environmental Variables

---

1. Motivation
2. Methodology
3. Data
4. Variables
5. Estimation results
6. Conclusions

# 1. Motivation

---

- Since the introduction of the **1992 Single Market Programme (SMP)** and the **first steps taken (2012) towards the EU Banking Union (EBU)** → the European Union (EU) has walked towards more integrated financial markets.
- An integrated financial market (ECB, 2020):
  - I. Single set of rules for financial institutions
  - II. The guarantee of an equal access to financial instruments and services for all market participants
  - III. Harmonized procedures that permit an equal treat of financial services' users (ECB, 2020)

**Main objective** → to permit the transaction of financial instruments and the provision of financial services under the same conditions in all EU countries.

- Advances in EBU (IMF, 2015):
  - I. Lower resolution, restructuring and compliance costs.
  - II. Elimination of any barriers to cross-border banking activity
  - III. Lower bank funding costs

**Under these conditions** → advances in the EU financial integration should have incentivized more banking competition.

# 1. Motivation

---

However:

- Empirical studies signal a **general trend of increasing banking market power** in the EU and a **persistent divergence among EU banks** (Delis and Tsionas, 2009).
- According to Cruz-García and Fernández De Guevara (2017) is mainly attributable **to country-specific factors**.
- ECB (2017): **ligation costs** and **differences in the legal and regulatory environment** could constitute persistent barriers to integration → which may lead to different competition scenarios within the EU.
- **To assess the EU banking competition scenario** → important to assess how environmental differences among EU members could affect the ability of banks to exercise market power.

This study aims to give response to the following **research questions**:

- ✓ Do different environmental conditions (such as different monetary policy or bank capital regulation) among EU countries affect banks' market power?
- ✓ Controlling for these environmental differences, have EU countries converged in market power levels from 2005 to 2019?

# 1. Motivation

---

- To answer these research questions, this study aims to:

Provide a new measure of banks' market power by controlling for the influence of environmental conditions which are known exercise influence on banks' performance.

❖ This new measure allows to:

- ✓ Level up the banks' playing field – by controlling for their particular environment
- ✓ Make proper cross-country market power comparisons
- ✓ Analysis of convergence or divergence trends in market power among groups of banks (EMU and Non-EMU).

Without controlling for the regulatory, institutional, or industry-specific environment, differences in banking market power between countries may hide these specific environmental divergences instead of reflecting internal bank-activity-driven differences that could lead to different market power levels.

# 1. Motivation

---

- **Methodology:** Frontier Model of Market Power proposed by *Kumbhakar et al. (2012)* & Maximum Likelihood (ML) random-effects truncated normal model of *Battese and Coelli (1995)* → Then a **Lerner index** is then estimated obtaining an *Environmentally-adjusted Lerner index*.
- **The analysis includes five environmental dimensions:**
  - (i) **EU monetary policy.** *Most studies find a positive relationship between short-term interest rates and banks' margins (for instance: Bolt et al., 2012; Borio et al., 2015; and Cleassens et al., 2018).*
  - (ii) **EU bank capital regulation.** *Hackenes and Schnabel (2011) defend that higher capital requirements inhibit competition for loans, prompting the increase in loan rates*
  - (iii) **Development of the financial system.** *Tan and Floros (2012): more developed banking institutions increase the demand for banking services, which incentivizes potential competitors to enter the market.*
  - (iv) **Market structure.** *SCP hypothesis Bain (1951). Although concentration indicators may not be adequate proxies to directly infer competition, they provide significant industry-specific information of banking markets.*
  - (v) **Economic shocks.** (Global Financial Crisis and Euro debt crisis).

## 2. Methodology

---

- 1<sup>st</sup> assumption. The output price (P) that banks set must be higher than the marginal cost (MC):

$$P > MC \equiv \frac{\partial C}{\partial Y} \quad (1)$$

- Multiplying both sides of equation (1) by the ratio of output to total cost, it follows:

$$P \frac{Y}{C} > MC \frac{Y}{C} = \frac{\partial C}{\partial Y} \frac{Y}{C} = \frac{\partial \ln C}{\partial \ln Y} \quad (2)$$

- $(PY/C)$  = Revenue share in total cost
- $(\partial \ln C / \partial \ln Y)$  = Cost elasticity

## 2. Methodology

---

- 2nd assumption. Bank's technology is represented by a **translog cost function**:

$$\ln C = \beta_0 + \sum_{j=1}^J \beta_j \ln W_j + 0.5 \sum_{j=1}^J \sum_{k=1}^J \beta_{jk} \ln W_j \ln W_k + \beta_Y \ln Y + 0.5 \beta_{YY} (\ln Y)^2 + \sum_{j=1}^J \beta_{jY} \ln W_j \ln Y + \beta_T T + 0.5 \beta_{TT} T^2 + \sum_{j=1}^J \beta_{jT} \ln W_j T + \beta_{YT} T \ln Y, \quad (3)$$

- The **cost elasticity** ( $\partial \ln C / \partial \ln Y$ ) is then equal to:

$$\frac{\partial \ln C}{\partial \ln Y} = \beta_Y + \beta_{YY} \ln Y + \sum_{j=1}^J \beta_{jY} \ln W_j + \beta_{YT} T \quad (4)$$

- The inequality (2) can be converted into an equality adding a **non-negative one-sided term,  $u$** :

$$\frac{PY}{C} = \frac{\partial \ln C}{\partial \ln Y} + u, \quad u \geq 0. \quad (5)$$

## 2. Methodology

---

- By adding a two-sided noise disturbance term,  $v$ , and developing the cost elasticity term, equation (4) becomes the following stochastic frontier function::

$$\frac{PY}{C} = \frac{\partial \ln C}{\partial \ln Y} + u + v = \beta_Y + \beta_{YY} \ln Y + \sum_{j=1}^J \beta_{jY} \ln W_j + \beta_{YT} T + u + v. \quad (6)$$

- $u$  represents the deviations of the revenue share to total cost from its frontier.
- Given that (5) has been derived from (1):
  - ✓ It is indifferent to obtain a measure of market power either by estimating the distance between the output price and the marginal cost or by estimating the distance between the revenue share in total cost ( $\frac{PY}{C}$ ) and its frontier ( $\frac{\partial \ln C}{\partial \ln Y} + v$ ).
  - ✓ Mark-ups estimates will be directly obtained from the estimation of equation (6).

## 2. Methodology

---

- If we define the “mark-up factor” ( $\theta$ ):

$$\theta = \frac{P-MC}{MC} \quad (7)$$

- The above specification (7) can be related to  $u$  as follows:

$$\theta = \frac{u}{\frac{\partial \ln C}{\partial \ln Y}} \quad (8)$$

- Once (6) is estimated, the mark-up factor,  $\hat{\theta}$ , can be obtained from:

$$\hat{\theta} = \hat{u} / \left( \hat{\beta}_Y + \hat{\beta}_{YY} \ln Y + \sum_{j=1}^{J-1} \hat{\beta}_{jY} \ln \tilde{W}_j + \hat{\beta}_{YT} T \right), \quad (9)$$

## 2. Methodology

---

- After obtaining  $\hat{\theta}$ , this value can be then employed to obtain the Lerner index (L) from the following relationship:

$$L = \frac{\hat{\theta}}{(1+\hat{\theta})} \quad (10)$$

- **Incorporation of environmental variables in Kumbhakar et al. (2012) model – by applying the Battese and Coelli (1995) simultaneous estimation:**

$$\frac{PY}{C} = \beta_Y + \beta_{YY} \ln Y_{it} + \sum_{j=1}^J \beta_{jYt} \ln W_{jt} + u_{it} + v_{it}. \quad (11)$$

$$u_{it} = z_{it}' \delta + \varepsilon_{it} \quad (12)$$

- $v_i \sim N(0, \sigma_v^2)$
- $u_i \sim N^+(\mu_i, \sigma_u^2)$
- Where:  $\mu_i = z_i' \delta$ ;  $z_i$  is the vector of environmental variables and  $\delta$  the vector of parameters

# 3. Data

---

- Unbalanced panel dataset of EU-28 banks spanning the period **2005-2019**:
  - **2005-2015**: Bureau Van Dijk's BankScope database
  - **2015-2019**: Moody's Analytics BankFocus database
  
- The sample comprises a total of **5,235 observations** for **705 banks**. Banks' specialisation: **Commercial, cooperative** and **savings banks**.

Variable name	Description	Source
<b>HHI</b>	Hirschman–Herfindahl index (HHI) for total assets	ECB Banking Structural Financial Indicators Database
<b>FID</b>	Financial Institutions' Depth. Normalized and concentrated index from: <ul style="list-style-type: none"> <li>○ Private-sector credit to GDP</li> <li>○ Pension fund assets to GDP</li> <li>○ Mutual fund assets to GDP</li> <li>○ Insurance premiums, life and non-life to GDP</li> </ul>	IMF Financial Development Index Database (IMF WP/16/5)
<b>FIA</b>	Financial Institutions' Access Normalized and concentrated index from: <ul style="list-style-type: none"> <li>○ Bank branches per 100,000 adults</li> <li>○ ATMs per 100,000 adults</li> </ul>	IMF Financial Development Index Database (IMF WP/16/5)
<b>FMD</b>	Financial Markets' Depth Normalized and concentrated index from: <ul style="list-style-type: none"> <li>○ Stock market capitalization to GDP</li> <li>○ Stocks traded to GDP</li> <li>○ International debt securities of government to GDP</li> <li>○ Total debt securities of financial corporations to GDP</li> <li>○ Total debt securities of nonfinancial corporations to GDP</li> </ul>	IMF Financial Development Index Database (IMF WP/16/5)
<b>G-SIB</b>	Dummy variable equal to 1 if the bank is listed as Global Systematically Important Bank, and 0 otherwise; in any year within the period 2011-2019.	Own elaboration. Data on G-SIBs from Financial Stability Board (FSB) official banks' lists
<b>Buffer</b>	Capital Buffer = (Equity/Total Assets) – Minimum capital adequacy ratio (8%)	Own elaboration. Data on Equity and Total Assets from BankScope and BankFocus databases
<b>IR</b>	Over-night or short-term interest rates For EMU countries: <ul style="list-style-type: none"> <li>○ Euro Over-Night Index Average (EONIA)</li> </ul> For non-EMU countries: <ul style="list-style-type: none"> <li>○ Over-night / three-month interest rates (e.g. for UK: Sterling OverNight Interbank Average index (SONIA))</li> </ul>	European Commission Eurostat Exchange and Interest Rates dataset and European Central Bank (ECB) Statistical Data Warehouse.
<b>Crisis</b>	Global Financial Crisis and Euro Sovereign Debt crisis: dummy variable equal to 1 if the year is 2008-2013; and 0 otherwise.	Own elaboration

## 5. Estimation results

Table 5. Posterior mean estimates of the Lerner index without environmental variables (BC95(2)).

<i>Estimated Lerner Index</i>	<i>Total sample</i>	<i>EMU</i>	<i>Non-EMU</i>
<i>Number of observations</i>	5,235	3,874	1,361
<i>Mean</i>	<b>0.147</b>	<b>0.136</b>	<b>0.173</b>
<i>Estimated cost elasticity (1)</i>	<i>Total sample</i>	<i>EMU</i>	<i>Non-EMU</i>
<i>Number of observations</i>	5,235	3,874	1,361
<i>Mean</i>	<b>0.921</b>	<b>0.914</b>	<b>0.937</b>

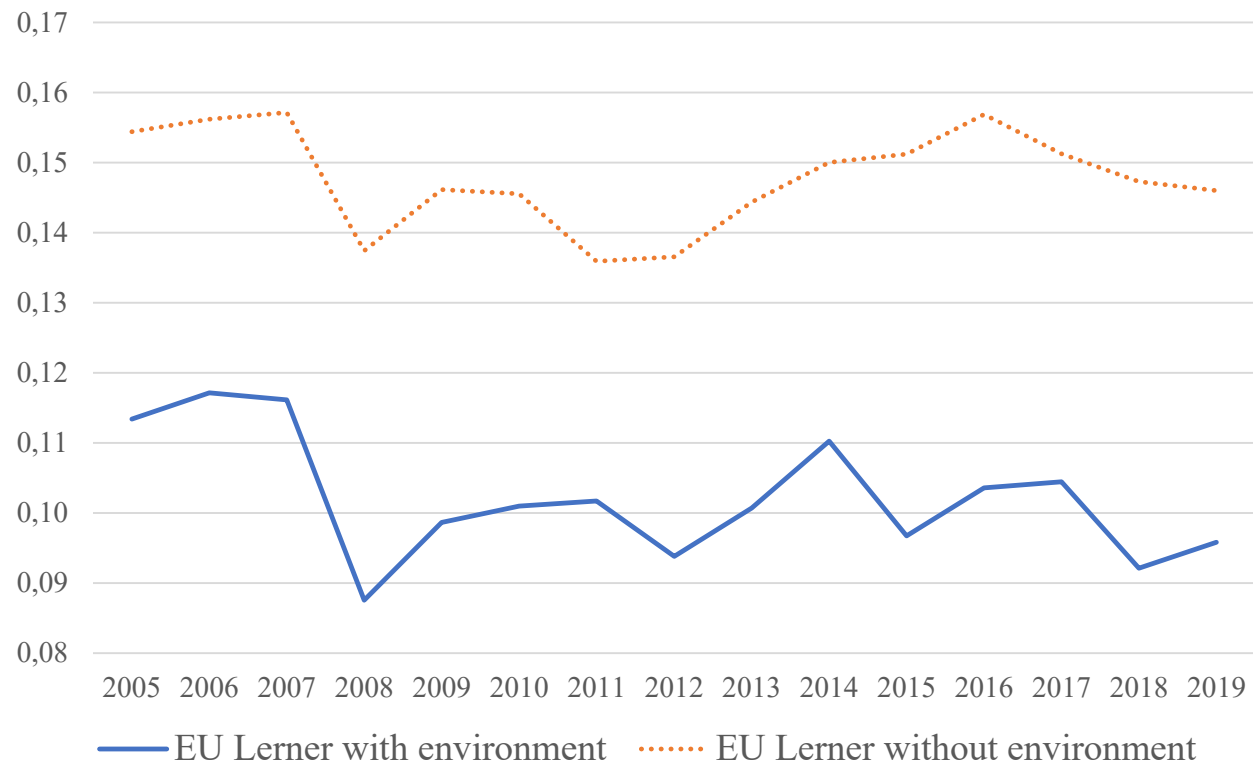
Table 6. Posterior mean estimates of the Lerner Index and scale elasticities with environmental variables included (BC95(1)).

<i>Estimated Lerner Index</i>	<i>Total sample</i>	<i>EMU</i>	<i>Non-EMU</i>
<i>Number of observations</i>	5,235	3,874	1,361
<i>Mean</i>	<b>0.103</b>	<b>0.081</b>	<b>0.164</b>
<i>Estimated cost elasticity (1)</i>	<i>Total sample</i>	<i>EMU</i>	<i>Non-EMU</i>
<i>Number of observations</i>	5,235	3,874	1,361
<i>Mean</i>	<b>0.961</b>	<b>0.956</b>	<b>0.975</b>

Note: (1): given that Returns to Scale:  $RTS = (1/\epsilon)$ . Then,  $\epsilon < 1$  indicates increasing returns to scale (economies of scale);  $\epsilon = 1$  indicates constant returns to scale; and  $\epsilon > 1$  indicates decreasing returns to scale (diseconomies of scale).

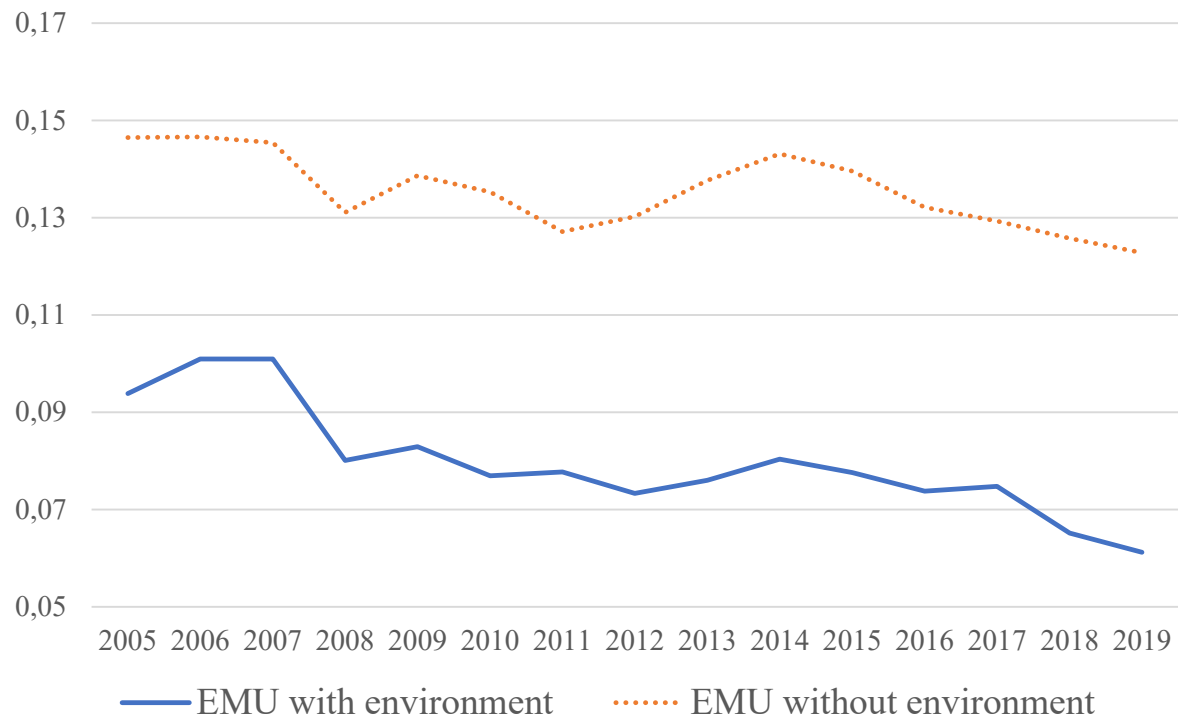
# 5. Estimation results

Figure 1. Mean Lerner Index for EU banks (2005-2019)



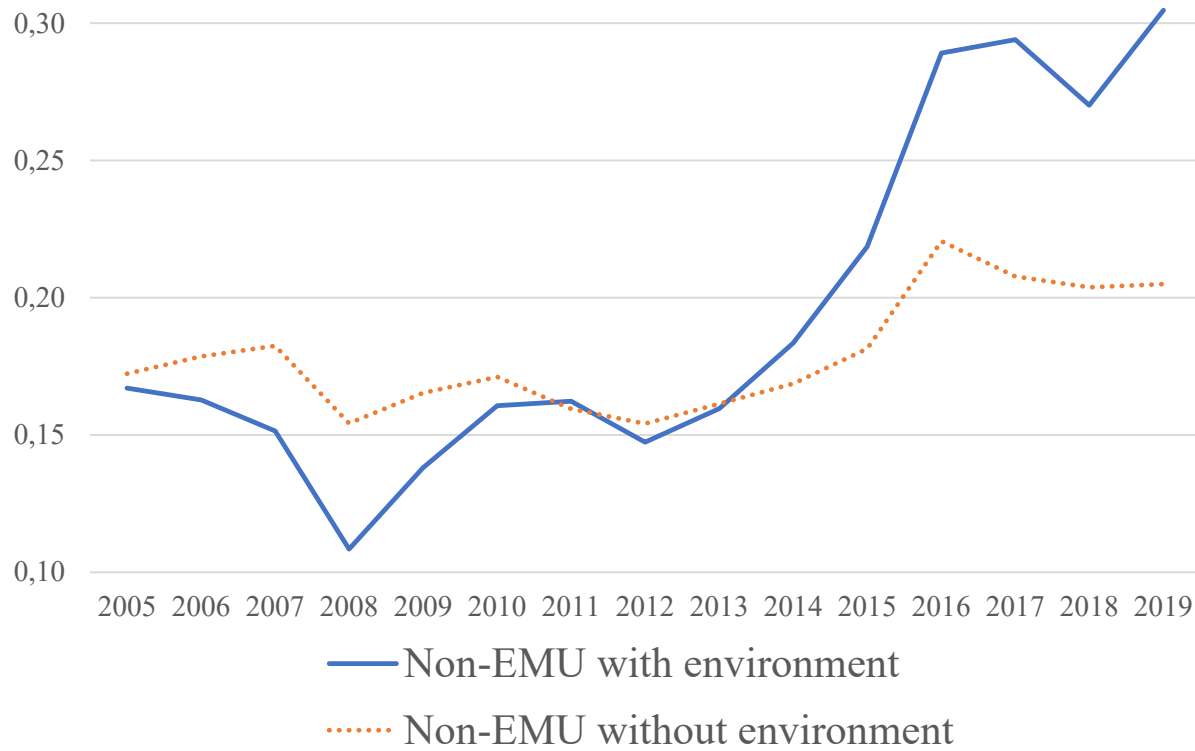
# 5. Estimation results

Figure 2. Mean Lerner Index for EMU banks (2005-2019)



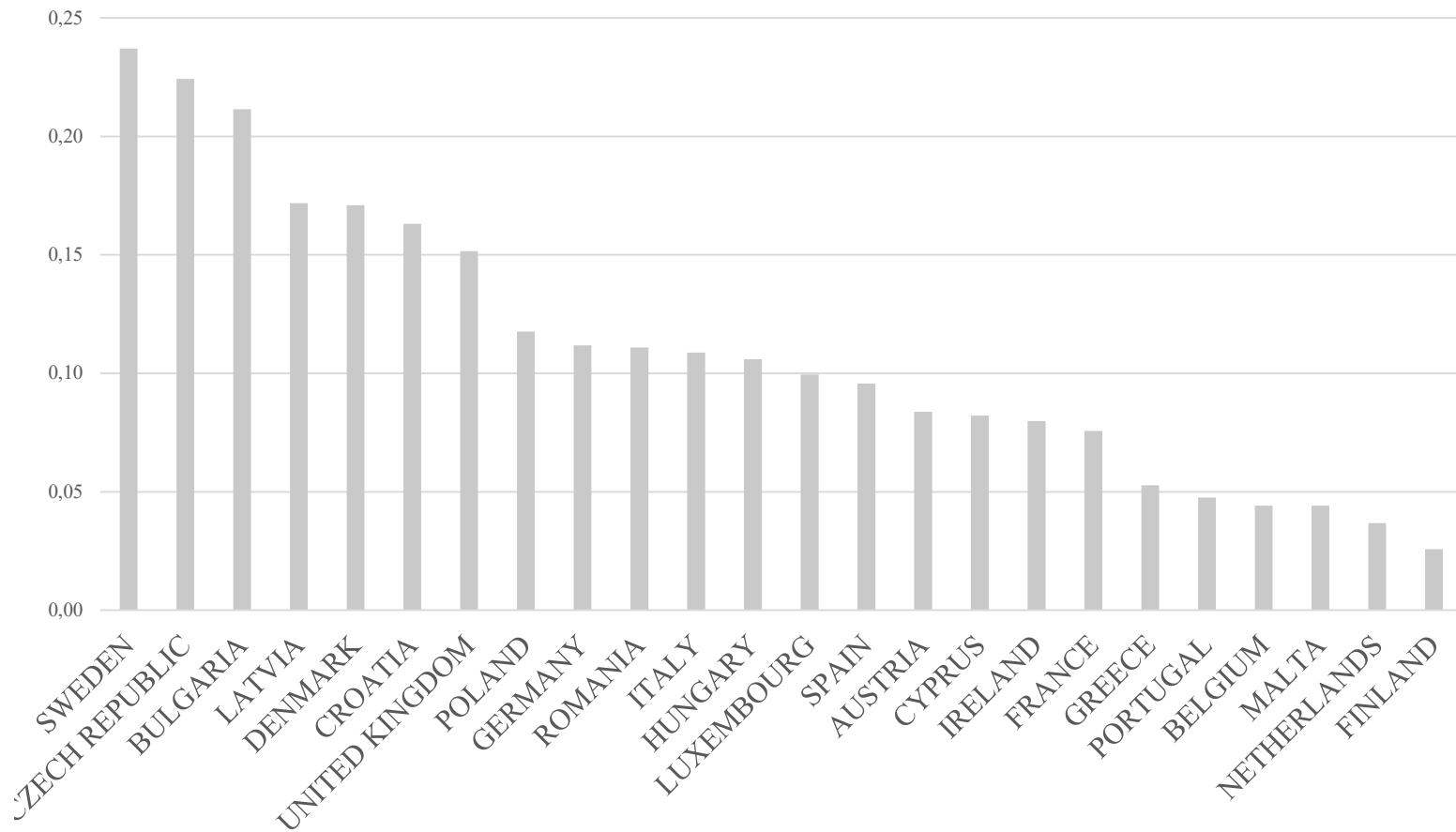
# 5. Estimation results

Figure 3. Mean Lerner Index for non-EMU banks (2005-2019)



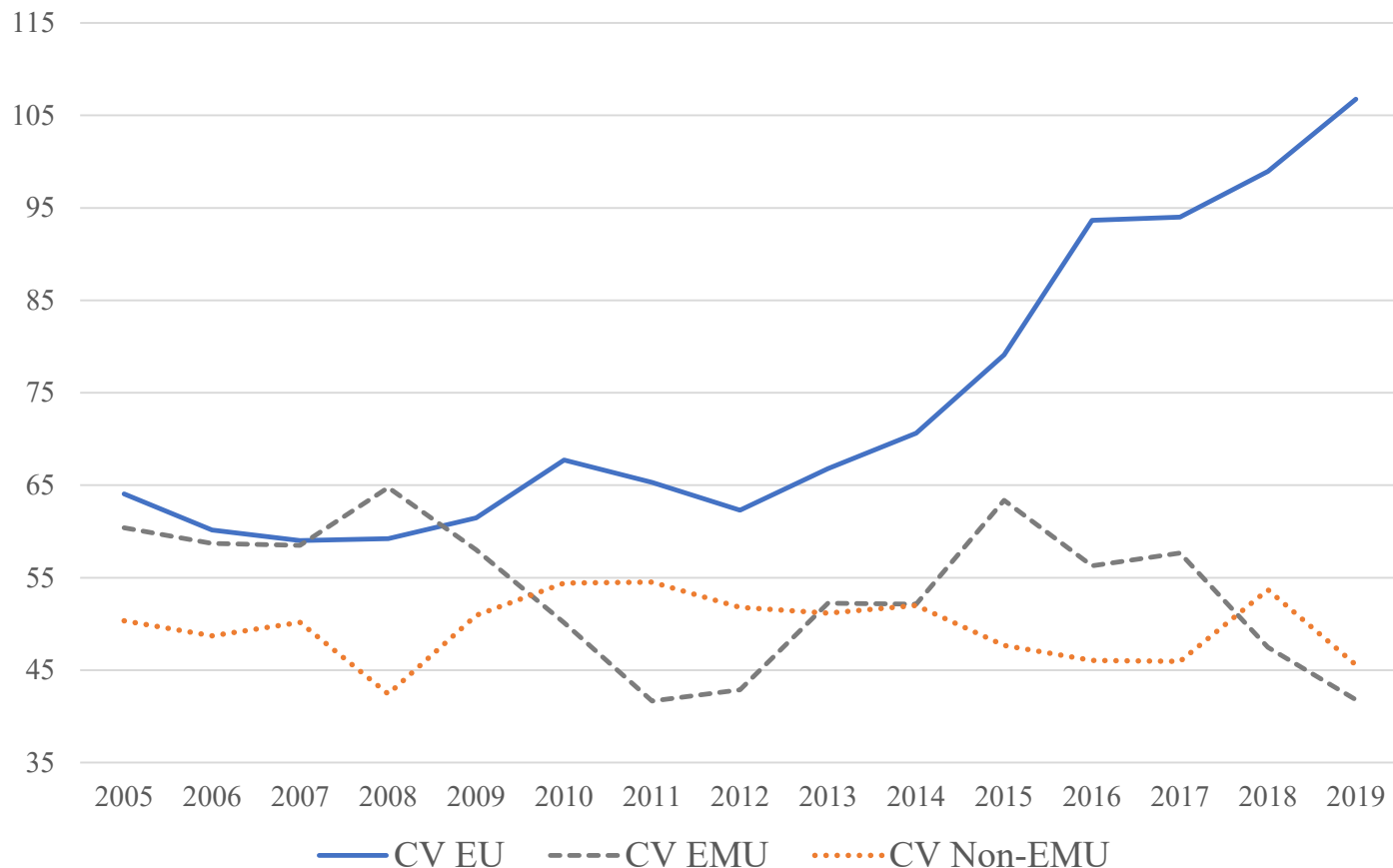
# 5. Estimation results

Figure 4. Average Lerner Index (from BC95(1)) estimation per country.



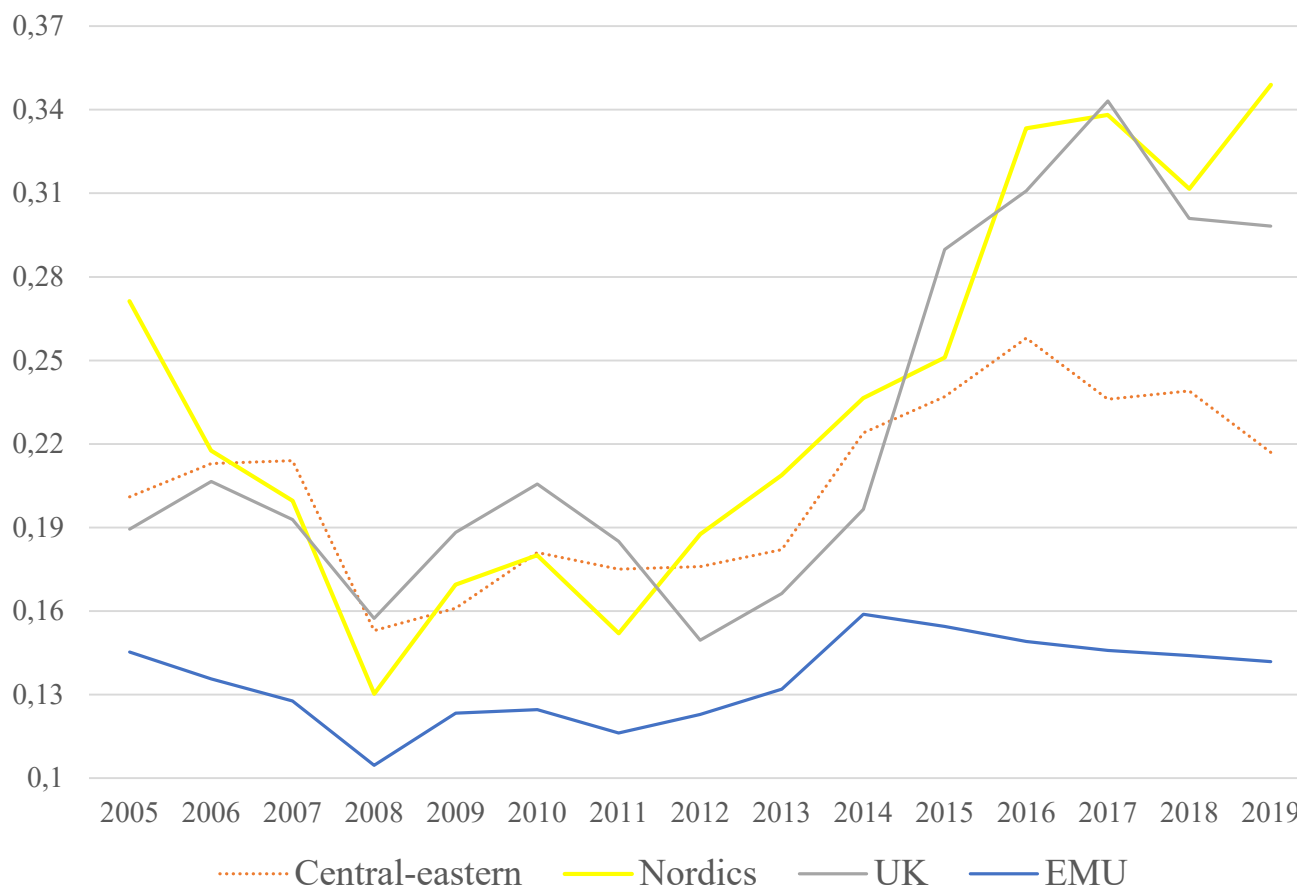
# 5. Estimation results

Figure 5. Evolution of the Coefficient of Variation per group of countries (2005-2019).



## 5. Estimation results

Figure 6. Mean Lerner index estimation with environmental variables by group of non-EMU banks.



# 6. Conclusions

---

- ❑ **Environmentally-adjusted Lerner index** → “cleaner” estimation of market power:
  - ❑ It **levels down Lerner index estimations** for the whole sample (EU) and for groups (EMU and Non-EMU).
  - ❑ **Boosts any trend** in market power levels for each group of banks (either positive or negative).
- ❑ **Notable divergence in market power levels between EMU and non-EMU banks** for the whole period of study (2005-2019). Intensified since 2012, due to the remarkably increase in market power levels within non-EMU countries → mainly driven by **UK and Nordic banks**.
- ❑ Environmentally-adjusted Lerner index reveals: Fragile although constant deterioration of banking market power levels within **EMU countries** → **may indicate advances in the Banking Union**.
- ❑ No process of market power convergence (within group) is obtained for **non-EMU banks** → persistent **barriers to the integration** of the EU banking market.
- ❑ *Further research:* to analyse the existing disparities detected for the group of non-EMU banks (specially for UK and Nordic banks), as well as, to study which factor may explain their sharp increase in market power observed from 2012.



University of  
Zurich<sup>UZH</sup>

---

# Day-Ahead Workshop on Financial Regulation

University of Zurich  
October 13-14, 2021

## Estimating the Market Power of Banks in the EU: A Stochastic Frontier Approach with Environmental Variables

*Cristina Ortega-González (cristinaog@uma.es)  
University of Málaga*