

EUROPEAN BANKING INTEGRATION: IS FOREIGN OWNERSHIP AFFECTING BANKING EFFICIENCY?

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Abstract. The aim of this study is to analyze how European integration and, especially, changes in ownership, has affected banking efficiency in Central and Eastern European countries which have recently experimented this process more intensely. Using a stochastic frontier approach, applied to panel data, we have estimated bank efficiency levels in a sample of 189 banks from 12 countries during the period 2000 to 2008 and we have analyzed the influence of some bank characteristics on these efficiency levels. The results show that European integration has significantly improved the cost efficiency of banks in these countries, but profit efficiency has significantly decreased. We have found very small differences between different ownership types and only a very small impact of foreign ownership on cost efficiency, showing that the entry of foreign ownership is not enough to explain the significant variations in banking efficiency after the accession.

Keywords: banking efficiency, European integration, banking ownership, stochastic frontier model, Bayesian inference, new member states.

JEL Classification: G14, G21.

Introduction

Banking sectors in Central and Eastern European countries have undergone major transformations over the past two decades firstly, as a consequence of the transition from a centrally planned economy to a market economy and, secondly, due to their European integration, characterized by the harmonization of regulation with EU standards, and also, by the access to a common capital market.

After some important changes in political, social and economic models in the early 1990s, it became clear that it was necessary to introduce major reforms into the banking and financial sectors to provide a basis for the market economy. These processes led to the establishment of specific regulations for banks and other financial intermediaries which permitted their modernization and rapid changes in their ownership structures.

The study of banking efficiency in these countries has become a recurrent topic in the literature. Furthermore, some authors affirm that it is one of the main factors to spur regional growth (Hasan *et al.* 2009). Some studies have analyzed the evolution of banking efficiency during the last two decades, when Central and Eastern European countries made important efforts to harmonize their legislations with European standards, although many of these studies have focused on the years before the 2004 enlargement, and with mixed results. For instance, Kasman and Yildirim (2006) analyzed 8 new EU members during the period 1995–2002 without finding improvements in banking efficiency. Mamatzakis *et al.* (2008) also suggest that the variation in cost efficiency scores among the new member states declines over time. By contrast, Rossi *et al.* (2004) analyzed 8 new EU members during the period 1995–2002 and found some evidence of improvements in both cost and profit efficiencies. In more recent studies, such as Kosak *et al.* (2009), which have analyzed more recent periods, there seems to be more coincidence in the results, showing that European integration has contributed to improve banking efficiency in the new EU members, especially on the costs side. However, recent evidence on profit efficiency is much more limited.

As a consequence of the establishment of new regulations for banking sectors, their ownership structures have dramatically changed over the period. Many authors have analyzed the impact that these transformations and, especially, the entry of foreign ownership, have had on banking performance in Central and Eastern European countries (see Table 1). One conclusion is that the entry of foreign capital has provided stability, efficacy and effectiveness to these banking systems (Revoltella 2006) and, as a result, it has improved the competitive environment and has provided more and improved services. However, as we can see in Table 1, when the studies focus on the impact of foreign ownership on individual bank performance, the results are not unanimous and, while some authors found some evidence that foreign banks are, on average, more efficient than their domestic counterparts, others with more recent data have not supported the improved performance of foreign ownership.

In this paper, we analyze the influence that European integration and ownership changes had on banking performance in 12 Central and Eastern European countries¹. Particularly, given the important changes in banking ownership structures that were a consequence of this process, we analyze whether the effects of this integration on banking efficiency are caused by these ownership changes, especially by the massive entry of foreign capital, or whether we have to look for other causes to explain these effects. To that aim, we have chosen the period 2000–2008 because of its importance, including the latest privatizations of big state-owned banks, the most intensive years of their European integration and the outbreak of the recent international financial crisis.

¹In order to homogenize our sample, we have excluded Cyprus and Malta because of their different political and economic antecedents and their different levels of financial development. We refer to the countries in our sample as Central and Eastern European countries with the Baltic States subsumed into this concept. As a result our sample includes Bulgaria, Croatia, the Czech Republic, Estonia, Hungary, Latvia, Lithuania, Macedonia, Poland, Romania, Slovakia and Slovenia.

Table 1. Summary of the findings on the efficiency of different banking ownership forms in Central and Eastern European countries

Author(s)	Sample	Period	Methodology	Results	Analyzed efficiency
Jemric, Vujcic (2002)	Croatia	1995–2000	DEA	Foreign banks are significantly more efficient than domestic banks.	Cost efficiency
Nikiel, Opiela (2002)	Poland	1997–2000	DFA	Foreign banks are more cost efficient and less profit efficient than other banks.	Cost and profit efficiency
Hasan, Marton (2003)	Hungary	1993–1998	SFA	Foreign banks and banks with higher foreign ownership are less efficient.	Cost and profit efficiency
Weill (2003)	Czech Republic and Poland	1997	SFA	Foreign banks are more efficient than domestic banks.	Cost efficiency
Bonin <i>et al.</i> (2005a)	11 CEE nations	1996–2000	SFA	Foreign owned banks are more efficient than other private banks, in particular if they have a strategic foreign owner.	Cost efficiency
Bonin <i>et al.</i> (2005b)	6 CEE nations	1994–2002	SFA	Foreign banks are the most efficient and government-owned banks are the least efficient.	Cost and profit efficiency
Fries, Taci (2005)	15 East European nations	1994–2001	SFA	Privatized banks with majority foreign ownership are the most efficient and those with domestic ownership are the least.	Cost efficiency
Matousek, Taci (2005)	Czech Republic	1993–1998	DFA	Foreign banks are more efficient than the other banks.	Cost efficiency
Havrylychuk (2006)	Poland	1997–2001	DEA	Foreign banks are more efficient than domestic banks.	Cost efficiency
Kasman, Yildirim (2006)	8 CEE nations	1995–2002	SFA	Foreign banks are more efficient than domestic banks.	Cost and profit efficiency
Zajc (2006)	6 CEE nations	1995–2000	SFA	Foreign banks are less efficient than domestic banks.	Cost efficiency
Yildirim, Philippatos (2007)	12 CEE nations	1993–2000	SFA/DFA	Foreign banks are more cost efficient but less profit efficient than domestically owned private banks and state-owned banks.	Cost and profit efficiency
Moreno <i>et al.</i> (2012)	12 CEE nations	2000–2008	SFA	There are no significant differences between different ownership forms.	Cost and profit efficiency

With regard to the influence of European integration, our hypothesis is that it had a positive effect on cost efficiency as a consequence of the adoption of the EU banking standards. For this reason, we hope that cost efficiency levels are higher after the incorporation of new EU members into the European Union. However, we believe that this effect has not been the same in profit efficiency for reasons such as increasing competition, development of non-bank financial sector or the beginning of the economic crisis.

As regards to ownership changes, we not only focus on the simple domestic vs. foreign ownership analysis, widely studied in literature, but also on how different types of ownership influence banking efficiency. As we can see in Table 1, this is a level of analysis that has, so far, received limited research, and where there is no complete evidence of results. Finally, we also analyze the importance of attracting a strategic foreign owner into the ownership structures by estimating the impact of its incorporation on the efficiency levels. In this line of research, our main objective is to provide empirical evidence about whether, as some previous studies focused in the 1990s uphold (Table 1), foreign banks are more efficient than their domestic counterparts or whether, as a consequence of the harmonization of standards caused by European integration these differences have gradually disappeared. These previous studies affirm that foreign ownership was more efficient due to their superior management skills and advanced technology, access to lower costs of funds from the parent company, less subject to domestic credit allocation rules, lack of legacy costs, and differences in clientele, such as a larger share of foreign-owned companies than that of domestically owned companies (Demirguc-Kunt, Huizinga 2000; Nikiel, Opiela 2002). Moreover, it is also argued that foreign banks tend to cherry pick the most profitable opportunities (Fang *et al.* 2011). However, our hypothesis is that, currently, as a consequence of the adoption of the same rules and participation in the same capital markets, the differences between different ownership forms are decreasing and, therefore, we believe that the type of ownership is no longer a determinant factor of banking efficiency in these countries, and therefore, the responsible authorities have to look for other ways to improve it.

Regarding the main contributions of this paper, as we can see above, some authors have analyzed the implications of European integration and ownership changes on banking efficiency separately; however, none of them has analyzed both factors together in order to know if ownership changes could explain all the variation found in banking efficiency during the European integration. Another relevant contribution of this paper is the use of Bayesian techniques to estimate banking efficiency, whose use is still scarce in this field research despite to be very useful in this kind of problems (Koop *et al.* 1997; Koop, Steel 2001). Finally, it should be noted that most studies on ownership effects on banking efficiency focus on the transition period (1990s) and the years immediately preceding the 2004 enlargement, while only a few have worked with more recent data including the years immediately following the accession of these countries, a period in which we can analyze the influence of these European milestones. In that sense, our study contributes to fill this gap.

This paper is organized as follows. In the next section, we describe some of the main changes in Central and Eastern European banking sectors during the last two decades in the framework of European integration Section 2 describes our data set. In Section 3, we outline the methodology used to estimate the banking efficiency levels and, in Section 4, we discuss our results. Finally, the last section provides a conclusion.

1. Banking transformation in Central and Eastern European countries

Banking sectors in the Central and Eastern European countries have undergone important changes since, they began a deep transformation in the early 1990s, as a consequence of market liberalization and their European integration. Although these changes did not occur at the same time or with the same intensity in all these countries, we can identify three important stages in the banking restructuring processes that are common to all of them: a first stage of privatizations and mergers, a second stage of consolidation and, subsequently, a third stage of massive entry of foreign ownership (Kosak, Cok 2008).

The first stages of privatizations, mergers and consolidation, led to a significant transfer of bank assets from public to private hands. As a consequence of this process, public ownership, which was the dominant ownership form at the beginning of 1990s, nowadays only maintains a small participation in the banking sectors of almost all these countries (according to EBRD, in 9 of the 12 countries, in 2008, public ownership controlled less than 6% of total banking assets).

Another very important factor in these reform processes was the massive entry of foreign ownership into the industry, either through the establishment of new branches or through participating in privatization processes, the latter being the most significant since foreign ownership acquired some of the biggest banks. As in the privatization process, there were remarkable differences between the countries with respect to when this entry took place. On the one hand, we can find countries such as Hungary, which were historically more receptive to facilitating this foreign entry even before the political changes. On the other hand, we find the Baltic and Balkan countries, which delayed the entry of foreign ownership into the sector until the mid 1990s.

According to EBRD statistics, between 1995 and 2008 banking assets under foreign control have grown in all countries without exception. In 1995, in 8 of the 12 countries, foreign ownership controlled less than 10% of total banking assets while, in 2008, this presence increased dramatically, with 5 countries having more than 90% of banking assets under foreign control and another 5 countries where this ownership form controlled more than 75% of total banking assets. Therefore, these results confirm the massive entry of foreign ownership into the industry as one of the most important characteristics of the reform process.

Finally, in order to know the context of each banking sector in 2008, in Table 2 we show the EBRD index banking reform value for each county, which indicates how advanced

the banking process reforms in all these countries were. Results show that, in 2008, 5 countries had already reached the maximum value of this index².

In short, it is evident that, during the last two decades, the banking sectors in these countries have not only undertaken major reforms but also that these reforms were, in most cases, near their end. For this reason, it is reasonable to think that, in the near future, other neighbouring countries can accelerate the negotiations in order to expedite its entry into the EU and, at the same time, to improve their banking performance and efficiency.

2. Data

Balance sheet and income data are taken from the Bureau Van Dijk's BankScope database, which is reviewed monthly, and the last edition used in this study is from October 2011. We have chosen all currently active private commercial banks³ in the 12 countries that have undergone major transformations in their banking systems as a consequence of European integration in recent years and for which data were available for all the necessary variables for the estimation of efficiency levels for at least four years between 2000 and 2008. In total, the data set consists of 189 banks with 2,369 observations for cost efficiency and 2,367 observations for profit efficiency.

To analyze the relation between the ownership form and banking efficiency, banks have been divided into four mutually exclusive and collectively exhaustive ownership types: foreign Greenfield banks, new domestic private banks, public banks and privatized banks⁴. To identify the effect of the incorporation of a strategic foreign owner on banking efficiency, we have also considered the date of access of these strategic investors into the ownership structure⁵. In Table 2, we can see the composition of the sample by ownership types and by countries at the end of 2008. It also shows how many banks have a strategic foreign owner.

We can see that new domestic private banks is the biggest category in the sample (43.92%), while privatized banks and foreign Greenfield banks account for 29.63% and 23.28% respectively. Finally public banks are the smallest category (3.17%). With respect to the presence of a strategic foreign owner, 91 banks in the sample have one

²This index has been compiled by the EBRD with the primary purpose of assessing the progress of the banking sectors of formerly centrally planned economies. As this indicator quantifies and qualifies the degree of liberalization of the banking industry, it is suitable for an explicit evaluation of the effect of banking sector reforms on the performance of banks (Brissimis *et al.* 2008). The values of EBRD index range from 1.0 to 4.0+, with 1.0 indicating a rigid centralized economy and 4.0+ implying the highest level of reform.

³As in Kasman and Yildirim (2006) and Laeven and Levine (2006), in this study, we have only included commercial banks because as Demirguc *et al.* (2004) argue, focusing on commercial banks improves the comparability of the banks in the sample.

⁴One problem of BankScope is that it only presents the ownership distribution for the last year, without consider the changes in the ownership structure over time. To overcome this limitation, we supplement the data with ownership information from the annual reports of each bank in the sample.

⁵We consider the presence of a strategic foreign owner in a privatized bank or in a new domestic private bank when more than 50% of the total stock of shares is held by non-domestic residents.

Table 2. Distribution of banks across bank types by country

Country	Ownership					Total
	New domestic private	Foreign Greenfield	Public banks	Privatized	Strategic owner	
Bulgaria	8	2	2	2	6	14
Croatia	19	4	0	4	10	27
Czech Republic	5	5	2	5	9	17
Estonia	4	0	0	1	4	5
Hungary	2	10	0	6	6	18
Latvia	12	1	1	5	10	19
Lithuania	4	0	0	4	4	8
Macedonia	4	1	0	5	5	10
Poland	9	8	1	8	14	26
Romania	9	7	0	3	11	19
Slovakia	3	4	0	5	8	12
Slovenia	4	2	0	8	4	14
Total	83	44	6	56	91	189

Notes:

1. The data of the first four columns show the number of banks by country and ownership.
2. The column labeled strategic owner shows the number of new private domestic banks and privatized banks with a strategic foreign ownership in their ownership structure.
3. The last column shows the number of banks by country.
4. The last row shows the total number of banks according to its ownership form.

in their ownership structure⁶. This presence implies that, at the end of the period, 135 banks have a wholly or majority foreign ownership (70.9% of the banks in the sample)⁷.

Croatia, with 27 banks (14.29%), is the country with the largest number of banks in the sample, followed by Poland (13.76%), while Estonia, with 5 banks, is the country with the least number of banks (2.65%) followed by Lithuania (4.23%).

3. Methodology

3.1. Cost and profit efficiency

To estimate banking efficiency, recent literature has considered two main types of banking efficiency: cost and profit efficiency. Cost efficiency provides a measure of how close a bank's actual cost is to what a best-practice firm's cost would be for producing an identical amount of output under comparable conditions. Profit efficiency measures

⁶Only new domestic private and privatized banks can present a strategic foreign owner in their ownership structures.

⁷Foreign Greenfield banks, new domestic private banks with a strategic foreign owner and privatized banks with a strategic foreign owner have a wholly or majority foreign ownership.

the extent to which a firm's profits fall below the profit of the best-practice firm⁸. Due to the difficulty of identifying the output prices, banking efficiency studies have concentrated mostly on cost efficiency measures (Weill, 2003; Fries, Taci 2005; Kosak *et al.* 2009, etc.). However, some empirical evidence has shown that profit efficiency is of greater quantitative importance than cost efficiency (see, Rossi *et al.* 2004; Kasman, Yildirim 2006), suggesting that the most important inefficiency is on the revenue side, either due to the choice of a composition of production that is not the most suitable given the prices of services or to the establishment of a bad pricing policy (Kasman, Yildirim 2006). Furthermore, the most cost efficient banks are not necessarily the most profit efficient ones and visa-versa (Pasiouras *et al.* 2009; Casu, Girardone 2004; Guevara, Maudos 2002; Berger, Mester 1997). A pioneer study in this line was Berger *et al.* (1993), where the authors state that the profit function allows the researcher to pinpoint the sources of inefficiency better because separate estimates of technical and allocative inefficiencies on both, the output and input sides of the firm, may be derived, as well as interactive effects.

For all these reasons, in this paper, we analyze cost and profit efficiency together to achieve a more complete vision of this topic.

3.2. Bayesian stochastic frontier models

In order to estimate the cost and profit efficiency, we have used stochastic frontier models⁹. We have used a Bayesian approach that allows us to make exact inferences about the parameters of the model (Koop, Steel 2001) without resorting to the use of asymptotic results of doubtful use in this context (an unbalanced panel with a short number of series with a limited sample size). To that aim, the Bayesian approach uses the posterior distribution of the parameters that is calculated using the Bayes theorem. If this distribution is analytically intractable, it can be calculated using MCMC methods (see, for instance, Robert, Casella 2004).

The Bayesian approach is the basis of some of the most recent and successful applied research (Koop *et al.* 1999, 2000; Notteboom *et al.* 2000; Kleit, Terrel 2001; Koop, Steel 2001). In particular, more recent studies have already demonstrated the validity

⁸Following Berger and Mester (1997), we can distinguish two profit functions depending on whether or not the existence of market power in the setting of output price is assumed. The standard profit function assumes perfect competition in the markets for outputs and inputs. According to Berger and Mester (1997), the alternative profit function is a closer representation of reality whenever the assumption of perfect competition in the setting of prices is questionable or when there are differences of quality among the individuals of the sample or when output prices are not accurately measured. As Kasman and Yildirim (2006) argue, since our sample includes a diverse group of countries with different levels of competition, it seems more appropriate to estimate an alternative profit function than a standard profit function for international comparisons. For this reason, we only estimate an alternative profit frontier. This alternative profit function has been employed in many studies of banking efficiency, including Rogers (1998), Berger and Mester (1997), Humphrey and Pulley (1997), Maudos *et al.* (2002), Bonin *et al.* (2005a, 2005b), Kasman and Yildirim (2006), and Pasiouras *et al.* (2009).

⁹The stochastic frontier approach was introduced by Aigner *et al.* (1977), it was made tractable by Jondrow *et al.* (1982), and its application to the banking sector was developed by Ferrier and Lovell (1990). Since then the stochastic frontier approach has become one of the most widely used techniques in this field of research (see, for example, Berger, Humphrey 1997; Kumbhakar, Lovell 2000).

and advantages of using Bayesian inference to analyze banking efficiency (Marsh *et al.* 2003; Kumbhakar, Tsionas 2005; Tecles, Tabak 2010; Assaf *et al.* 2011). Bayesian analysis of a stochastic frontier function was first proposed by Broeck *et al.* (1994), and provides the researcher with a set of more flexible models which overcome the need to impose prior sampling distributions on the efficiency term of the composed error term that characterizes conventional stochastic frontier approaches (Murillo-Zamorano 2004). The Bayesian approach presents several advantages over the maximum likelihood method, traditionally used in the literature to estimate these kinds of models. It let include “prior” information about parameters and provides statistical tools to compare non-nested models in terms of their goodness of fit to the data that takes into account the uncertainty associated to the estimation of their parameters. Finally, the Bayesian approach makes it easier to estimate robust hierarchical models to analyze the influence of a set of covariates on the efficiency distribution.

Zhang (2000) compared the performance of Bayesian and maximum likelihood estimation methods in terms of the mean square error criterion, showing the superiority of the former in estimating stochastic frontier models. For more details about the advantages of the Bayesian methodology see Koop and Steel (2001).

In addition, the Bayesian methodology makes it possible analyze the statistic significance of the models and its parameters. We can select the most adequate model by means of Bayesian comparison procedures such as the Bayes factor or alternatively, penalized likelihood criteria such as the BIC criterion or the DIC criterion, which takes into account the parsimony and the goodness of fit of the model to the data. Additionally, we can also analyze the statistic significance of the parameters of the model by means of Bayesian credibility intervals which contains with a given probability, the true value of the parameter and whose validity is subject to the validity of the selected model. The limits of these intervals are calculated from the adequate quantiles of the posterior distribution of the parameters.

3.2.1. The model

We have opted for the added value approach (Berger, Humphrey 1992). Following Humphrey and Pulley (1997), we consider that banks provide two main categories of financial services: (1) intermediation and loan services; and (2) payment, liquidity and safekeeping services. Therefore, this study considers deposits as input and output at the same time since they imply creation of value added¹⁰. Thus, following Dietsch and Lozano-Vivas (2000), Maudos and Pastor (2001), Maudos *et al.* (2002), Cavallo and Rossi (2002), Carvallo and Kasman (2005), Pasiouras *et al.* (2009), among others, we have used three outputs: deposits (D), loans (L) and other earning assets (G), and three input prices: price of capital (PC), (ratio of total operating expenses net of personnel expenses to fixed assets), price of funds (PF), (ratio of financial expenses to total deposits) and price of labour (PL), (ratio of total personnel expenses to total assets)¹¹.

¹⁰ Further discussion on the definition of inputs and outputs variables in Berger and Humphrey (1992), Tortosa-Ausina (2002) or Inklaar and Wang (2013).

¹¹ We use total assets rather than the number of employees because there are several missing values for the latter. Our approach is consistent with several previous studies including Maudos *et al.* (2002),

Our dependent variables are the total cost (C) for cost efficiency and the profit before taxes (B) for profit efficiency.

We have used a translog specification¹² for the model. To account for heterogeneity between countries (different technology, competition...) and years (economic environment, technologic change...), we have included fixed effects for each country and year¹³. So, the minimum cost (or maximum profit) that one bank can reach depends on the country where the bank is established and also depends on the analyzed year. So, if i denotes the bank and t the period, the equation of the model is given by:

$$\begin{aligned}
 y_{it} = & \alpha + \beta_1 d_{it} + \beta_2 l_{it} + \beta_3 g_{it} + \beta_4 pc_{it} + \beta_5 pf_{it} + \beta_6 pl_{it} + \beta_7 d_{it}^2 + \beta_8 d_{it} l_{it} + \beta_9 d_{it} g_{it} + \\
 & \beta_{10} d_{it} pc_{it} + \beta_{11} d_{it} pf_{it} + \beta_{12} d_{it} pl_{it} + \beta_{13} l_{it}^2 + \beta_{14} l_{it} g_{it} + \beta_{15} l_{it} pc_{it} + \beta_{16} l_{it} pf_{it} + \beta_{17} l_{it} pl_{it} + \\
 & \beta_{18} g_{it}^2 + \beta_{19} g_{it} pc_{it} + \beta_{20} g_{it} pf_{it} + \beta_{21} g_{it} pl_{it} + \beta_{22} pc_{it}^2 + \beta_{23} pc_{it} pf_{it} + \beta_{24} pc_{it} pl_{it} + \\
 & \beta_{25} pf_{it}^2 + \beta_{26} pf_{it} pl_{it} + \beta_{27} pl_{it}^2 + \sum_{j=2}^{12} \beta_{27+j-1} IP_{ij} + \sum_{j=2}^9 \beta_{38+j-1} IT_{ij} + u_{it} + v_{it},
 \end{aligned} \tag{1}$$

if $y_{it} = \log(C_{it})$, and:

$$\begin{aligned}
 y_{it} = & \alpha + \beta_1 d_{it} + \beta_2 l_{it} + \beta_3 g_{it} + \beta_4 pc_{it} + \beta_5 pf_{it} + \beta_6 pl_{it} + \beta_7 d_{it}^2 + \beta_8 d_{it} l_{it} + \beta_9 d_{it} g_{it} + \\
 & \beta_{10} d_{it} pc_{it} + \beta_{11} d_{it} pf_{it} + \beta_{12} d_{it} pl_{it} + \beta_{13} l_{it}^2 + \beta_{14} l_{it} g_{it} + \beta_{15} l_{it} pc_{it} + \beta_{16} l_{it} pf_{it} + \beta_{17} l_{it} pl_{it} + \\
 & \beta_{18} g_{it}^2 + \beta_{19} g_{it} pc_{it} + \beta_{20} g_{it} pf_{it} + \beta_{21} g_{it} pl_{it} + \beta_{22} pc_{it}^2 + \beta_{23} pc_{it} pf_{it} + \beta_{24} pc_{it} pl_{it} + \\
 & \beta_{25} pf_{it}^2 + \beta_{26} pf_{it} pl_{it} + \beta_{27} pl_{it}^2 + \sum_{j=2}^{12} \beta_{27+j-1} IP_{ij} + \sum_{j=2}^9 \beta_{38+j-1} IT_{ij} - u_{it} + v_{it},
 \end{aligned} \tag{2}$$

if $y_{it} = \log(B_{it})$, where $d_{it} = \log(D_{it})$, $l_{it} = \log(L_{it})$, $g_{it} = \log(G_{it})$, $pc_{it} = \log(PC_{it})$, $pf_{it} = \log(PF_{it})$, $pl_{it} = \log(PL_{it})$, IP_{ij} and IT_{ij} are indicators of the j -th country and the j -th period, respectively; u_{it} is the inefficiency term; $v_{it} \sim N(0, \sigma_v^2)$ is the error and $t \in T_i \subseteq \{1, \dots, T\}$; $i = 1, \dots, N$, where T_i is the observation period of the i -th bank and N is the number of analyzed banks.

3.2.2. Estimation of the model

To reduce the potential error of specification, we have estimated two kinds of stochastic frontier model: an exponential model assuming that $u_{it} \sim \text{Exp}(\lambda_{Z_{i,t}})$ and a truncated

Carvalho and Kasman (2005), Becalli *et al.* (2006) and Pasiouras *et al.* (2009).

¹²This function proposed by Christensen *et al.* (1973) allows us to relax some restrictions associated to Cobb-Douglas function. The translog form does not impose the hypothesis regarding the constant elasticity of the production function or of the elasticity between inputs.

¹³There is a relatively recent literature dealing with bank efficiency in Europe which considers if a common frontier exists or, alternatively, each bank should be compared with its country-peers only. The adoption of the same rules and participation in the same capital market contribute to the existence of a common frontier. However, some studies support the fact that banks in different countries may not operate under the same circumstances due to differences in technology, competition, supervision, etc. (Bos, Schmiedel 2007).

normal model assuming that $\text{con } u_{i,t} \sim \text{NT}_{(0,\infty)}(\sigma_{z_{i,t}}^2)$, where $z_{i,t} \in \mathbb{N}$ is a discrete variable that indexes the explanatory characteristics of bank inefficiency $u_{i,t}$. Therefore the mean efficiency level of a bank with characteristics $z_{i,t}$ is given by $E[r_{it}|z_{i,t}] = E[e^{-u_{i,t}} | z_{i,t}]$.

Given that we adopt a Bayesian approach, it is necessary to provide a prior distribution of the parameters of the model. In our case, we have used the following non informative distribution:

$$\alpha \sim N(0, s_\alpha^2) \text{ with } s_\alpha^2 = 10^6, \quad (3)$$

$\beta_i \sim N(0, s_\beta^2)$ with $s_\beta^2 = 10^6$ for $i = 1, \dots, p$ (p number of covariates in the frontier),

$$\tau_{z_{i,t}} = \frac{1}{\sigma_{z_{i,t}}^2} \sim \text{Gamma}(0.001, 0.001),$$

$$\tau_v = \frac{1}{\sigma_v^2} \sim \text{Gamma}(0.001, 0.001),$$

if the model is normal truncated, and:

$$\alpha \sim N(0, s_\alpha^2) \text{ with } s_\alpha^2 = 10^6,$$

$$\beta_i \sim N(0, s_\beta^2) \text{ with } s_\beta^2 = 10^6 \text{ for } i = 1, \dots, p,$$

$$\lambda_{z_{i,t}} \sim \text{Gamma}(0.001, 0.001), \quad (4)$$

$$\tau_v = \frac{1}{\sigma_v^2} \sim \text{Gamma}(0.001, 0.001),$$

if the model is exponential, where we assume that all these distributions are mutually independent.

The estimation of the parameters of the model was carried out from their posterior distribution calculated by using the Bayes theorem. Given that this distribution is not analytically tractable, we use Monte Carlo Markov Chain (MCMC) methods, namely, the Gibbs sampling algorithm described in Griffin and Steel (2007). Using this algorithm, we obtain a sample from the posterior distribution. This sample is used to obtain the value of DIC criterion and to calculate a point estimation and a 95% Bayesian credibility interval for each parameter using the posterior median and the 2.5 (Q2.5) and 97.5 (Q97.5) quantiles, respectively. The statistical significance of the effects of the covariates $z_{i,t}$ is evaluated by comparing the models with and without the covariates

according to DIC criterion. Finally, we analyse the existing difference by means of the 95% Bayesian credibility intervals of the mean efficiency levels $E[r_{i,t}|z_{i,t}]$ and the visual comparison of the boxplot of their posterior distribution.

4. Results

Firstly, we have estimated the model parameters for both cost and profit efficiency, using an exponential distribution and a normal truncated distribution, respectively, and without including explanatory variables for the efficiency term ($z_{i,t} = 1 \forall t \in T_i; i \in \{1, \dots, N\}$). All the estimation and figures were obtained using the statistical package *WINBUGS 4.1*.

The estimated mean efficiency for the whole sample is 96.39% for cost efficiency and 87.48% for profit efficiency, respectively, using an exponential distribution, and 97.86% for cost efficiency and 81.04% for profit efficiency, respectively, using a normal truncated distribution. These results show that, on average, the banks included in the sample have been operating near from the efficiency frontier, especially in relation to costs, where, on average, banks could reduce the inefficiency by 3–4%. These results show that the most important inefficiency is on the revenue side since banks could increase their profits by 12–19%, on average. This greater quantitative importance for profit inefficiency was also noted in previous studies, as Rossi *et al.* (2004) or Kasman and Yilidirim (2006). Furthermore, in both cases (cost and profits) there are significant country and time effects. To be more specific, with the only exception of Macedonia in the cost frontier, the rest of country effects are significant negatives. Therefore, being equal in all other covariates, Bulgarian banks tend to have higher costs and profits while Macedonian banks tend to have higher costs. With respect to the higher profits of Bulgarian banks this could be attributed to fact that until 2003, still over 70% of bank assets were invested in government treasuries that had high interest margin (Fang *et al.* 2011). As regards to the higher costs of Bulgarian and Macedonian banks, it is known that the adoption of European legislation has forced these countries to recognize higher costs in their income statements.

We used the DIC criterion of Spiegelhalter *et al.* (2002)¹⁴ to compare the goodness of fit of the exponential and the truncated normal models. As we can see in Table 3, the exponential model showed a better goodness of fit to the data for the estimation of the two types of efficiency.

¹⁴The Deviance Information Criterion (DIC) evaluates the goodness of fit of the model through its out of sample predictive behaviour. It is given by the expression $\bar{D} + p_D$ where \bar{D} is the posterior mean of the deviance statistic and quantifies the goodness of fit to data, and $p_D = \bar{D} - \hat{D}$ where \hat{D} is the deviance statistic, calculated assuming that the true value of the parameter is equal to its posterior mean, is called the number effective of parameters and quantifies the parsimony of the model. The lower the value of DIC, the better the goodness of fit to the data. For more details, see Koop *et al.* (1997), Griffin and Steel (2007).

4.1. Banking efficiency and European integration

Due to the progressive adoption of EU legislation, which has provided greater stability and competitiveness in Central and Eastern European banking sectors, we expect that European integration contributed to improve cost banking efficiency in these countries. However, due to the increasing competition in the sector and the development of a non-bank financial sector, lower levels of profit efficiency after the bank's country incorporation into the EU are expected.

To analyze how European integration has influenced the banking efficiency levels in the considered countries, we have estimated the mean cost and profit efficiency for the whole sample depending on whether the analyzed period was before or after the incorporation of the country into the EU. To that aim we have taken $z_{i,t} = 1$ if $t < t_{i,incorporation}$ while 2 is a dummy variable that signals if period t is previous or posterior to $t_{i,incorporation}$ that denotes the year of incorporation into the EU of the country of the i -th bank. Table 4 shows the estimation of the mean efficiency level before and after the incorporation, and Table 5 shows the results of the comparison of model procedure of the exponential and the truncated normal models according to the DIC criterion.

With respect the mean efficiency levels, our results show a different evolution for cost and profit efficiency after the incorporation into the EU. We can see (Table 4) that, independently of the assumption about the distribution of the inefficiency term, cost efficiency tends to increase after the incorporation, while profit efficiency tends to decrease, being both changes statistically significant.

If we compare the models with and without the $z_{i,t}$ covariate (compare Tables 3 and 5), it can be appreciated that models which incorporate the date covariate have a better goodness of fit according to DIC criterion, being the exponential model which shows a better goodness of fit to the data for the estimation of the two types of efficiency.

In order to analyse if this effect is common to all the countries, we have estimated models where $z_{i,t}$ indicates the country of the i^{th} and if the period $t < t_{i,incorporation}$ or $\geq t_{i,incorporation}$ (see Table 6).

Regarding cost efficiency, it can be appreciated that, with the sole exception of Hungary, the rest of the countries have increased their cost efficiency after its incorporation into the EU, with the largest improvements corresponding to Latvia, Bulgaria, Romania, Czech Republic and Poland. These results confirm the positive impact of European integration on cost efficiency observed for the whole sample. The result of Hungary is not surprising since their cost efficiency was already very high before its integration in EU. One reason for this high-level is that Hungary was the first country in the area to carry out major reforms in the banking system. In that sense, some studies focused on the previous years before the integration, as Hasan and Marton (2003) pointed out that the early reorganization initiatives, flexible approaches to privatization, and liberal policies towards foreign banks' involvement with the domestic institutions helped build a relatively stable and increasingly efficient banking system. For example, even before the political change, the Hungarian government had been receptive to foreign banking

Table 3. Comparison of the models which assume an exponential and a truncated normal distribution of the efficiency term (in bold signalled the model with the best goodness of fit to data according to DIC criterion)

Cost efficiency				
Model	\bar{D}	\hat{D}	p_D	DIC
Exponential	-1079.61	-1189.94	110.32	-969.29
Truncated normal	-1014.11	-1077.77	63.66	-950.44
Profit efficiency				
Model	\bar{D}	\hat{D}	p_D	DIC
Exponential	-1993.11	-2665.48	672.37	-1320.74
Truncated normal	-2157.33	-3056.99	899.66	-1257.67

activity as it allowed three foreign banks to operate in the country from 1985. In addition, Hungary was the first country to shed legacies of the centrally planned economy by privatizing all but one of its major banks by mid-1997 (Bonin *et al.* 2005b). In summary, our results do not show an increase in cost efficiency for Hungary associated to the European integration because it had already experienced such improvements prior to the accession.

With regard to profits, the existence of a clear common trend in its evolution cannot be appreciated. While some countries have increased their profit efficiency after the integration (Slovakia, Estonia, Latvia or Czech Republic), other countries have decreased their levels (Slovenia, Hungary, Lithuania, Poland, Romania and Bulgaria). These results show that the impact of European integration on profit efficiency is not clear, and it might depend on the country. However, it is noteworthy that, despite the significant improvements observed in cost efficiency, most countries have experienced a decrease in their profit efficiency; in addition, when profit efficiencies tend to increase, these improvements are not significant statistically. Besides, models which assume a common effect for all the countries have better goodness of fit properties (Table 5). All these results suggest that European integration have had a negative impact on the revenue side.

Table 5 shows the results of the comparison of models where we can see that exponential models which distinguish between countries have a better goodness of fit for the cost efficiency, while exponential models which assume a common effect for all the countries have a better goodness of fit for the profit efficiency.

These results confirm the hypothesis that European integration has had a different impact on cost and profit efficiency. On one hand, it is evident the positive effect on cost efficiency where the integration in EU has contributed to improving banking cost efficiency for the whole sample and for almost all countries. This result is in line with some previous studies, which justify this positive impact by the higher concentration in these sectors (Rossi *et al.* 2004), the higher presence of foreign ownership and greater macro-economic stability (Fries, Taci 2005), the privatization process (Bonin *et al.* 2005b) or

Table 4. Estimated mean bank efficiency before and after the incorporation of the bank's country into the EU

Efficiency term distribution	Cost efficiency			Profit efficiency		
	Exponential distribution			Exponential distribution		
Mean efficiency	2.50%	median	97.50%	2.50%	median	97.50%
Before incorporation into the EU	0.9253	0.9384	0.9519	0.8712	0.8834	0.8949
After incorporation into the EU	0.9775	0.9932	0.9991	0.8309	0.8504	0.8687
Efficiency term distribution	Normal truncated distribution			Normal truncated distribution		
Mean efficiency	2.50%	median	97.50%	2.50%	median	97.50%
Before incorporation into the EU	0.9310	0.9532	0.9785	0.8023	0.8146	0.8267
After incorporation into the EU	0.9658	0.9798	0.9880	0.7754	0.7946	0.8136

Table 5. Comparison of the models that use the date of the bank's country incorporation into the EU as explanatory variable of the inefficiency term distribution (in bold signalled the model with the best goodness of fit to data according to DIC criterion)

Model	Cost efficiency			
	\bar{D}	\hat{D}	p_D	DIC
Exponential common effect	-1201.20	-1370.16	168.96	-1032.24
Normal truncated common effect	-1048.21	-1143.62	95.411	-952.802
Exponential country effects	-1225.67	-1361.89	136.22	-1089.46
Normal truncated country effects	-1220.25	-1416.2	195.947	-1024.31
Model	Profit efficiency			
	\bar{D}	\hat{D}	p_D	DIC
Exponential common effect	-2083.30	-2781.73	698.43	-1384.88
Normal truncated common effect	-2257.87	-3183.80	925.92	-1331.95
Exponential country effects	-1823.04	-2337.4	514.368	-1308.67
Normal truncated country effects	-1935.23	-2583.21	647.98	-1287.25

the higher level of competition (Kosak *et al.* 2009; Fries, Taci 2005). Finally, we think that the strengthening of prudential regulations has also had a prominent role in this evolution of cost efficiency in the new EU members. On the other hand, the effect of the EU integration point to a common negative effect on revenue efficiency causing that the improvements in cost efficiency are not reflected in profit efficiency. Similar results

Table 6. Estimated mean bank efficiency for the each country before and after its incorporation into the EU

Cost efficiency						
Country	Before EU incorporation			After EU incorporation		
	2.50%	median	97.50%	2.50%	median	97.50%
BULGARIA	0.8748	0.9350	0.9884	0.9406	0.9935	0.9994
CZECH REPUBLIC	0.8986	0.9461	0.9976	0.9681	0.9952	0.9994
CROATIA*	0.9644	0.9940	0.9994			
SLOVAKIA	0.9281	0.9805	0.9992	0.9749	0.9960	0.9995
SLOVENIA	0.9600	0.9935	0.9995	0.9685	0.9950	0.9995
ESTONIA	0.9037	0.9828	0.9992	0.9386	0.9936	0.9994
HUNGARY	0.9658	0.9948	0.9994	0.9572	0.9936	0.9994
LATVIA	0.8578	0.9022	0.9337	0.9431	0.9880	0.9993
LITHUANIA	0.9111	0.9795	0.9990	0.9552	0.9946	0.9995
MACEDONIA*	0.7753	0.8320	0.8772			
POLONIA	0.9137	0.9664	0.9987	0.9395	0.9876	0.9995
ROMANIA	0.9567	0.9922	0.9991	0.9493	0.9928	0.9994
Profit efficiency						
Country	Before EU incorporation			After EU incorporation		
	2.50%	median	97.50%	2.50%	median	97.50%
BULGARIA	0.9570	0.9930	0.9993	0.9333	0.9923	0.9994
CZECH REPUBLIC	0.7887	0.8368	0.8756	0.8066	0.8526	0.8901
CROATIA*	0.9515	0.9889	0.9991			
SLOVAKIA	0.8860	0.9408	0.9988	0.8861	0.9522	0.9987
SLOVENIA	0.7729	0.8320	0.8766	0.7371	0.8005	0.8515
ESTONIA	0.9247	0.9874	0.9992	0.9434	0.9927	0.9994
HUNGARY	0.8239	0.8675	0.9028	0.7927	0.8436	0.8842
LATVIA	0.8298	0.8818	0.9259	0.8831	0.9240	0.9952
LITHUANIA	0.9159	0.9854	0.9991	0.8631	0.9319	0.9976
MACEDONIA*	0.8539	0.9006	0.9401			
POLONIA	0.7736	0.8249	0.8649	0.7618	0.8075	0.8465
ROMANIA	0.8419	0.8760	0.9053	0.7305	0.8318	0.8972

*The incorporation of Croatia and Macedonia into the EU was after 2008.

were reported in previous studies such as Kasman and Yildirim (2006) or Mamatzakis *et al.* (2010), where there does not seem to be any continuous improvement in profit efficiency over time. As an explanation, Mamatzakis *et al.* (2010) found a negative association between profit efficiency and the development of a non-banking financial sector. In our opinion, two possible causes explain this negative effect on the profit efficiency: first, the increasing competition in these sectors, caused by the massive entry of foreign banks and the development of a non-banking financial sector, which has limited the revenues for bank. And second, the adoption of regulations which restrict the activities that bank can undertake. In this sense, Pasiouras *et al.* (2009) pointed out that less regulatory control allows banks to engage in various activities which result in exploitation of economies of scale and generate income from several sources, increasing profit efficiency.

As we have mentioned before, one of the main changes in these banking sectors over the last two decades was the transformation of their ownership structures, first, as a consequence of the privatization process and, subsequently, with the massive entry of foreign capital. There is some consensus in the literature about the positive effect of the first process, but there is more discussion with respect to the presence of foreign ownership, especially when more recent data are analyzed. For this reason, in the next section, we analyze whether these changes in banking ownership structures and, especially, foreign entry, can explain the evolution of cost and profit efficiency during the European integration.

4.2. Impact of ownership on banking efficiency

We have estimated the cost and profit efficiency levels for four ownership types: new domestic private banks, foreign greenfield banks, public banks and privatized banks. For this purpose, we take $z_{i,t} = k$ if bank i belonged to group k in period t and 0 otherwise, where each group corresponds to the four ownership types. Table 7 shows the results of the comparison of models. It can be seen that the best performance corresponds to the exponential model for cost efficiency and the normal truncated model for profit efficiency.

The estimated mean cost and profit efficiencies for models with the best goodness of fit properties can be seen in Table 10 and Figures 5 (cost efficiency) and 6 (profit efficiency).

With regard to costs, it can be seen that foreign Greenfield banks tend to be the more efficient in mean, followed closely by public banks and new domestic private banks, without appreciating significant differences among them. However, privatized banks tend to be the least efficient.

Regarding profits, foreign Greenfield banks tend to be the most efficient, followed by new domestic private banks and public banks without significant differences between them. Finally, privatized banks tend to be the least profit efficient ownership form, being in this case the differences with the other groups statistically significant.

Therefore foreign Greenfield banks tend to be a little more efficient than the other groups for both cost and profit efficiency, a better performance commonly justified by the use of new technologies and modern and more efficient management and operating techniques (Fang *et al.* 2011; Grigorian, Manole 2002). However, differences with new domestic private banks and public banks are small. This lack of significant differences is becoming common in recent studies with more recent data which compare the efficiency of different ownership forms (Mamatzakis *et al.* 2008; Moreno *et al.* 2012). Furthermore, some studies, such as Bonin *et al.* (2005b), have shown that after privatization banks tend to increase their efficiency (especially when a strategic foreign owner is attracted), so in the future the efficiency of privatized banks will probably increase being more similar to the levels of the other groups. These results support our hypothesis that differences between different ownership forms are decreasing, probably as a consequence of the adoption of the same rules and participation in the same capital markets, and therefore, we believe that the type of ownership will no longer be a determinant factor of banking efficiency in these countries.

It could be surprising, however, the high-level of efficiency showed by public banks and the low-level showed by privatized banks. With respect to public banks, studies focused on the 1990s and early 2000s traditionally associated this ownership form with lower levels of efficiency and a worse performance (Fries, Taci 2005; Bonin *et al.* 2005b; Barth *et al.* 2001). However, more recent studies equate its efficiency to the efficiency of other ownership forms (Mamatzakis *et al.* 2008; Kraft *et al.* 2006). The main reason for these results is that during 1990s most public banks in these countries had solvency and liquidity problems, and governments decided to privatize them (Bonin, Wachtel 1999; Barisitz 2005). So in recent studies the sample of public banks is mostly composed of a few well-managed banks. Whereas, privatized banks include some of the problematic public banks in the 1990s, whose legacy have been a burden for their efficiency levels in the following years. These facts justify the results obtained.

For further analysis of the effect of ownership on bank efficiency and considering the attraction of a strategic foreign owner, we carried out a new analysis in which we consider the existence of six ownership types combining the ownership type and the presence/absence of a strategic foreign owner. Thus, the new categories are: new domestic banks without a strategic foreign owner, privatized banks without a strategic foreign owner, new domestic banks with a strategic foreign owner, privatized banks with a strategic foreign owner, public banks and foreign Greenfield banks. For this purpose, we take $z_{i,t} = k$ if bank i belonged to group k in period t and 0 otherwise.

The results of the comparison of model are presented in Table 7. It can be seen that the exponential model showed a better goodness of fit for cost efficiency and the normal truncated model showed a better fit for profit efficiency. Table 9 and Figures 3 (cost efficiency) and 4 (profit efficiency) show the estimation of the mean efficiency levels of each group using the above models.

Table 7. Comparison of models which use the ownership form as an explanatory covariate of the inefficiency term distribution (in bold signalled the model with the best goodness of fit to data according to DIC criterion)

Cost efficiency				
Model	\bar{D}	\hat{D}	p_D	DIC
Exponential without strategic foreign owner	-1070.28	-1160.52	90.23	-980.05
Normal truncated without strategic foreign owner	-1022.97	-1103.18	80.21	-942.77
Exponential with strategic foreign owner	-1149.92	-1274.80	124.88	-1025.04
Normal truncated with strategic foreign owner	-1036.54	-1128.75	92.214	-944.32
Profit efficiency				
Model	\bar{D}	\hat{D}	p_D	DIC
Exponential without strategic foreign owner	-1968.54	-2589.29	620.74	-1347.80
Normal truncated without strategic foreign owner	-2162.37	-2960.04	797.67	-1364.70
Exponential with strategic foreign owner	-1998.85	-2622.10	623.25	-1375.60
Normal truncated with strategic foreign owner	-2179.13	-2964.95	785.83	-1393.30

Table 8. Estimated mean bank efficiency according to its type of ownership without distinguishing presence/absence of a strategic foreign owner

Efficiency term distribution	Cost efficiency			Profit efficiency		
	Exponential distribution			Normal truncated distribution		
Mean efficiency	2.50%	median	97.50%	2.50%	median	97.50%
New domestic private banks	0.9583	0.9814	0.9959	0.8418	0.8577	0.8727
Foreign Greenfield banks	0.9696	0.9934	0.9995	0.8516	0.8704	0.8888
Public banks	0.9569	0.9907	0.9992	0.8050	0.8414	0.8729
Privatized banks	0.9419	0.9563	0.9709	0.7355	0.7540	0.7713

With regard to costs (Table 9 and Fig. 3), new private banks with strategic owner tend to be the most efficient banks, followed by foreign Greenfield banks, public banks and privatized banks with strategic foreign owner. All these ownership forms showed very similar levels of cost efficiency. Privatized banks without strategic foreign owner and new private banks without strategic foreign owner tend to be the least cost efficient banks. Our findings of the greater cost efficiency of foreign-owned banks, either

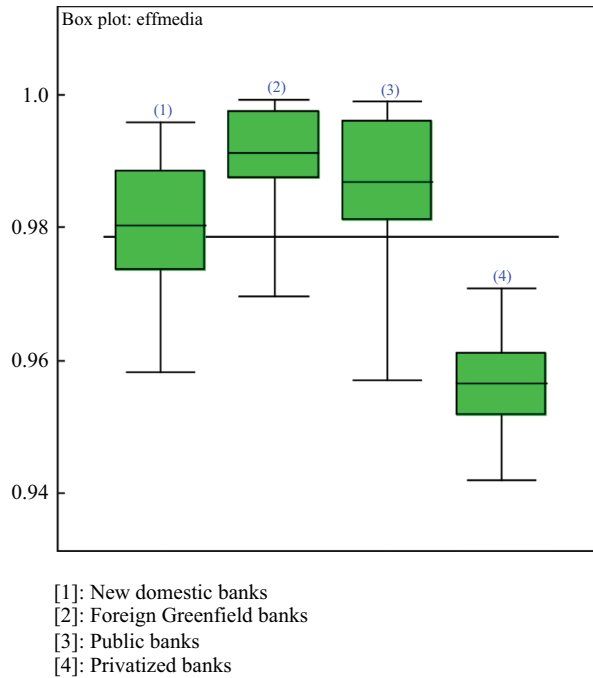


Fig. 1. Boxplot of the posterior distribution of the mean cost bank efficiency classified according to its type of ownership without distinguishing presence/absence of a foreign strategic owner and using the exponential model

privatized or newly established, are consistent with those of Fries and Taci (2005), Grigorian and Manole (2002), Yildirim and Philippatos (2007), and Bonin *et al.* (2005a). However, our results, which uses more recent data, shows that differences between different groups are not statistically significant, and smaller than in these previous studies. Thus, results show that differences in cost efficiency between different ownership forms have been reduced in recent years.

As for profits (Table 9 and Fig. 4), we observe that new domestic private banks without strategic foreign owner tend to be the most efficient ownership form, followed by foreign Greenfield banks, public banks and new domestic private banks with strategic foreign owner. It is noteworthy that differences between these ownership forms are quite small. However, privatized banks without foreign investors tend to be significantly less efficient than the previous groups, and privatized banks with foreign owner are significantly the least profit efficient ownership type.

If we focus on the effect of attracting a strategic foreign owner to the bank ownership structure, its positive effect is only confirmed for cost efficiency. New private banks without strategic foreign owner tend to be significantly less cost efficient than new private banks with the foreign investor, and the same result is found with privatized banks, being privatized banks with strategic foreign owner more cost efficient than privatized

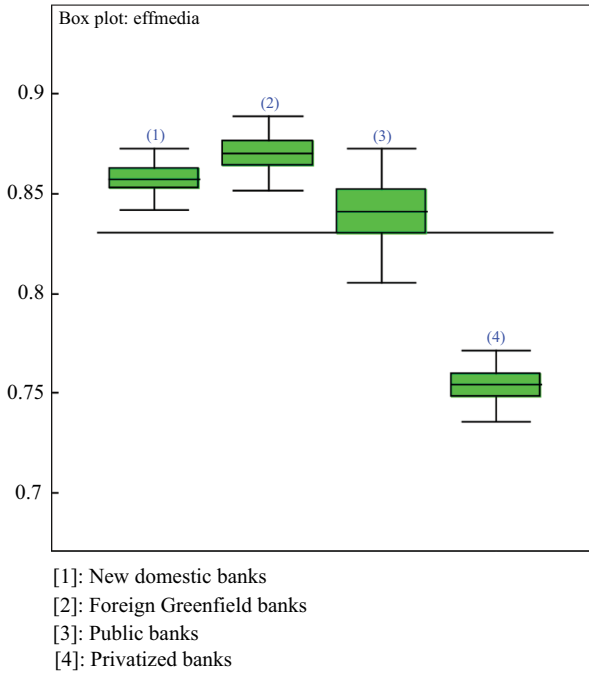


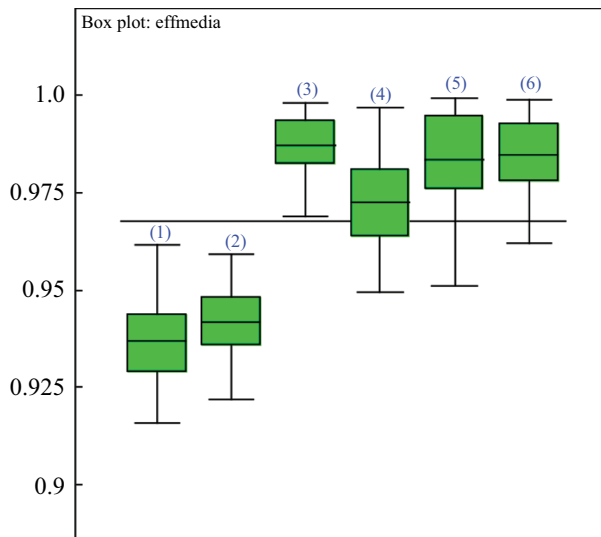
Fig. 2. Boxplot of the posterior distribution of the mean profit bank efficiency classified according to its type of ownership without distinguishing presence/absence of a foreign strategic owner and using the truncated normal model

banks controlled by domestic investors. This positive effect of attracting a strategic foreign owner on cost efficiency has also been reported in previous studies (Bonin *et al.* 2005b; Fries, Taci 2005).

However, if we focus on profit efficiency, we can see that new private and privatized banks tend to be more efficient when there is no strategic foreign owner. Some previous studies have reached similar results, showing better cost efficiency for foreign ownership and better profit efficiency for domestic banks (Yildirim, Philipatos 2007). Some explanations of this fact are that foreign banks may have more difficulties than domestic banks to deal with a host country's regulations, banking supervision rules, local judiciary in general, and corruption (Lensink *et al.* 2008). Other studies explain these results by the idiosyncratic features of local customers and service delivery systems (Hasan, Marton 2003). However, our more detailed study shows that this lower profit efficiency is not present in foreign Greenfield banks (which is the second most profit efficient ownership form), and therefore, we cannot generalize for all foreign ownerships. A more likely explanation is that, during the banking restructuring processes in the 1990s, governments adopted some policies to promote the entry of foreign investors in troubled banks, whose legacy has been a burden for their profit efficiencies during the analyzed years.

Table 9. Estimated mean bank efficiency according to its type of ownership and distinguishing the presence/absence of a strategic foreign owner in the bank

Efficiency term distribution	Cost efficiency			Profit efficiency		
	Exponential distribution			Normal truncated distribution		
Mean efficiency	2.50%	median	97.50%	2.50%	median	97.50%
New domestic private banks without strategic foreign owner	0.9158	0.9359	0.9616	0.8704	0.8892	0.9083
Privatized banks without strategic foreign owner	0.9217	0.9422	0.9590	0.7653	0.7938	0.8197
New domestic private banks with strategic foreign owner	0.9690	0.9883	0.9980	0.8157	0.8361	0.8550
Privatized banks with strategic foreign owner	0.9493	0.9718	0.9970	0.7162	0.7379	0.7574
Public banks	0.9509	0.9868	0.9992	0.8131	0.8489	0.8800
Foreign Greenfield banks	0.9618	0.9861	0.9991	0.8471	0.8661	0.8851



- [1]: New domestic private banks without foreign strategic owner
- [2]: Privatized banks without foreign strategic owner
- [3]: New domestic private banks with foreign strategic owner
- [4]: Privatized banks with foreign strategic owner
- [5]: Public banks
- [6]: Foreign Greenfield banks

Fig. 3. Boxplot of the posterior distribution of the mean cost bank efficiency classified according to its type of ownership, distinguishing the presence/absence of a foreign strategic owner and using the exponential model

Conclusions

In this study we have analyzed the influence of European integration on banking efficiency in some Central and Eastern European countries by analyzing the impact of its EU integration. We have observed that after the integration, banks tend to increase significantly their mean cost efficiency levels, showing the positive impact of European integration on cost efficiency. Conversely, when we analyzed the evolution of mean profit efficiency we noticed the existence of a negative tendency.

Since one of the most visible effects of European integration in Central and Eastern European banking sectors has been the ownership changes, especially the massive entry of foreign ownership, we have also analyzed whether the ownership type, and in particular foreign presence, appears as a key factor to explain these improvements in cost efficiency and the apparent deterioration of profit efficiency. Our results have shown that although foreign Greenfield banks tend to be a little more efficient, differences with new domestic private banks and public banks are not significant, suggesting that these differences have been reduced in recent years, probably as a consequence of the adoption of the same rules and the participation in the same capital market. Only privatized banks tend to be significantly less efficient than the other groups,

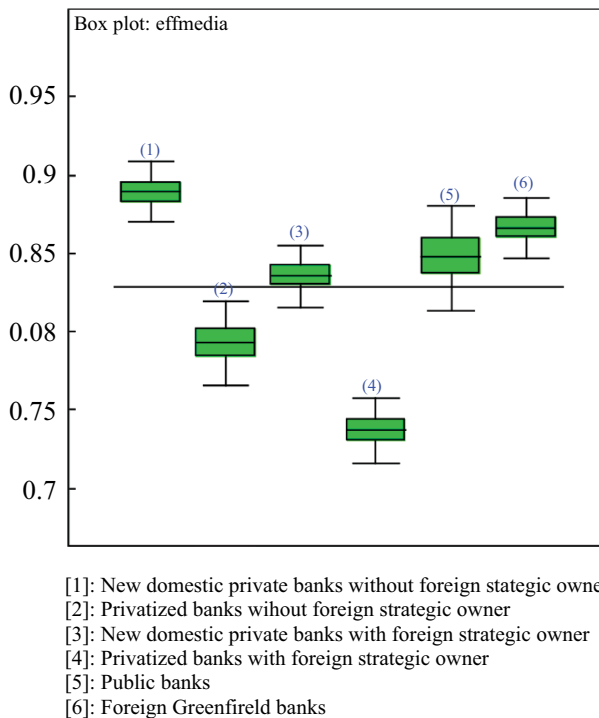


Fig. 4. Boxplot of the posterior distribution of the mean profit bank efficiency classified according to its type of ownership distinguishing the presence/absence of a foreign strategic owner and using the truncated normal model

especially in relation to profits, as a consequence of their legacies. However, some previous studies suggest that banking efficiency tends to increase after privatization, so these differences will be even smaller in the future, and for this reason we think that the ownership form is no longer a determinant factor of banking efficiency in these countries.

When we consider the presence or absence of a strategic foreign owner, we have observed a positive effect on cost efficiency, but not for profit efficiency, where banks seem to be burdened by their legacies. The incorporation of a strategic foreign investor particularly, and foreign ownership in general, could be associated with some higher levels of cost efficiency. However, the differences we found are not enough to explain the significant improvement of cost efficiency detected after the EU integration and, therefore these improvements could have their origins in other factors such as increasing competition or strengthening of prudential regulations. Similar conclusions are reached for profit efficiency, where the high efficiency of foreign Greenfield banks shows that the negative evolution after the EU integration in many countries, is not directly caused by the massive entry of foreign ownership, but it could be due to other causes such as the increasing competition, the development of a non-banking financial sector, or the adoption of regulations that limit banking revenues.

On the basis of the results obtained, several future research directions arise. First, after verifying the improvement of cost banking efficiency in these countries as a consequence of the regulation harmonization with EU standards, it would be interesting to analyze whether there is a convergence process in cost efficiency between the new and the EU-15 members. In addition, the lack of statistical significance for the ownership form suggests that, today, it is no longer a determinant factor of banking efficiency in these countries. So, one future line of research will be to identify which are the determinant factors of bank efficiency in the new EU members today, by analyzing different variables related to banking regulation and supervision, banking structure, financial development and macroeconomic conditions, among others.

Finally, in this study, we have analyzed cost and profit efficiency levels separately. Since costs and profits are closely related, we think that it would be very interesting and more realistic to try to estimate these two efficiencies together.

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