# Are private banks more efficient than public banks? Evidence from Russia

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#### **Abstract**

We study whether bank ownership is related to bank efficiency in Russia. We find that foreign banks are more efficient than domestic private banks and – surprisingly – that domestic private banks are not more efficient than domestic public banks. These results are not driven by the choice of the production process, the bank's environment, the management's risk preferences, the bank's activity mix, size or the econometric approach. The evidence in fact suggests that domestic public banks are more efficient than domestic private banks and that the efficiency gap between these two types of banks is not lower after the introduction of deposit insurance in 2004. This may be due to increased switching costs or to the moral hazard effects of deposit insurance. The policy conclusion is that the efficiency of the Russian banking system may benefit more from increased levels of competition and higher access of foreign banks than from bank privatization.

JEL classification: G21; P30; P34; P52

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#### 1. Introduction

This paper assesses the efficiency of the nascent Russian banking system. The central question we pose is whether bank ownership has any effect on bank efficiency in Russia. We discern foreign-owned banks (foreign banks), privately owned banks (private banks) and state-owned banks (public banks). We find that foreign banks are more efficient than domestic private banks and – surprisingly – that domestic private banks are not more efficient than domestic public banks. These results are not driven by differences in activity mix, risk preferences or bank environment and not explained by the absence of explicit deposit insurance for domestic private banks.

Transition countries appear to be a fertile testing ground for the comparative analysis of public and private banks' efficiency, but first appearances can be deceiving. Indeed, this comparative analysis failed to yield clear answers because in most countries foreign entry and bank privatization went hand in hand. By consequence the empirical results for these countries were largely interpreted in terms of efficiency gaps between foreign and domestic ownership rather than between public and private ownership. In Russia however partial bank privatization was achieved relatively quickly, while foreign bank entry remained at a relatively low level in the first 15 years of transition<sup>2</sup>. Still, partial public ownership in various forms remained a robust characteristic of the Russian banking sector throughout transition. The Central Bank of Russia (CBR) has played an important role through the commercial banks under her direct control, namely Sberbank and Vneshtorgbank. In addition, government bodies of several levels own banks. There are examples of villages, provinces, cities, federal bodies and state firms in this position. For October 2001 for example, we find that the 27 banks that are majority owned by state bodies (out of 1277 banks in total) control 53% of banking assets and 39% of banking liabilities. Neglecting the CBR's commercial banking activities through Sberbank and Vneshtorgbank., the remaining 25 public banks hold no less than 6% of total banking assets and 8% of total banking liabilities. The Russian banking industry therefore presents us with the exceptional opportunity to disentangle efficiency differences between foreign, public and private banks for a sufficiently large number of banks. This study is therefore a complement to the literature on foreign ownership and efficiency in emerging market economies and its conclusions contribute to our understanding of emerging market economies' banking sectors.

Efficiency comparisons between public and private banks are cumbersome in emerging market economies because both types of banks are subject to different institutional environments, for example the implicit full deposit insurance typically enjoyed by public banks, but not by private banks. Any found differences in the cost effectiveness between

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<sup>&</sup>lt;sup>2</sup> The Central Bank of Russia (CBR) repeatedly showed its eagerness to cap foreign entry to the banking sector. The Association of Russian Banks has consistently lobbied the government to limit foreign bank entry using the classic infant industry protection argument. Russia was ultimately forced to commit itself to a gradual opening of its financial market to foreign competition because of its desire to entry the WTO.

private and public banks may therefore be attributable to this difference in deposit insurance, which may render public banks' access to deposits less costly in terms of labor and physical capital. In Russia too, public banks were always covered, albeit implicitly, by deposit insurance, while household deposits held at private banks are covered by deposit insurance only since 2004. To control for this we perform our estimations for two sub-samples, one before (2002) and one after (2006) the introduction of deposit insurance for household deposits at private banks. This allows us to assess whether any found difference in efficiency may be partly attributable to differences in deposit insurance and whether the more level playing field of generalized deposit insurance for household deposits effectively reduces the efficiency difference.

In the following section we overview the bank efficiency literature in connection with our study. Section 3 presents the recent history of the Russian banking sector. This is followed by an overview of the data in section 4 and the estimation methodology in section 5. Section 6 lays out the main results. Section 7 provides further robustness checks by repeating the analysis for a size -matched sample and employing a very different econometric approach. We end with concluding remarks in section 8.

#### 2. Related literature

The empirical literature on privatization in transition countries has found that the method and timing of privatization are related to its performance effects. Frydman et al. (1999) find that privatization has no beneficial effect on performance if firms fall under the sway of insider owners (managers or employees), while the positive performance effect is pronounced if the firm is privatized to outsider owners. Brown et al. (2006) document that foreign privatization has larger productivity effects than domestic privatization in a set of four transition countries.

There is also ample evidence for transition countries that foreign firms are more efficient than domestic firms, be it in the banking sector or in other sectors. Foreign banks may be more efficient than domestic ones because of their more advanced technology, superior management practices, better access to capital or the implicit deposit insurance through the deep pockets of the foreign mother bank.

These economy-wide results are sustained by more detailed banking sector studies that apply stochastic frontier models. Weill (2003) shows in a study of the Czech Republic and Poland that foreign-owned banks are indeed more efficient than domestic-owned banks and that this is driven neither by differences in bank size nor by differences in the structure of activities. Hasan and Marton (2003) find in a Hungarian country-study that foreign banks were more efficient already in the period 1993-1997, early in transition. Fries and Taci (2005) find in a study of 15 East European transition countries (including Russia) that private banks are more cost efficient than state-owned banks. Within the class of private

banks, they confirm the result of Weill (2003) that privatized banks with majority foreign ownership are the most cost efficient. These are followed by newly established private banks, both domestic and foreign owned, and finally by privatized banks with majority domestic ownership, though these are still more efficient than state-owned banks. Bonin et al. (2005a) analyze the effects of ownership on bank efficiency on a set of eleven transition countries for the period 1996-2000. They apply a stochastic frontier approach to compute bank-specific efficiency scores and relate these to ownership in second-stage regressions. Foreign-owned banks are again confirmed to be more cost-efficient, collect more deposits and grant more loans than other banks. The magnitude of increased efficiency from foreign ownership is 6% or higher. State-owned banks are not appreciably less efficient than de novo domestic private banks, but they are less efficient than those already privatized and, which provides support to the idea that better banks were privatized first. In a companion paper with comparable methodology Bonin et al. (2005b) analyze whether the method and the timing of bank privatization affect bank efficiency. They find that voucher privatization does not lead to increased efficiency and early-privatized banks are more efficient than later-privatized banks.

Kraft, Hofler and Payne (2006) study the Croatian banking system and find that new private and privatized banks are not more efficient than public banks and that privatization does not immediately improve efficiency, while foreign banks are substantially more efficient than all domestic banks.

A number of studies apply data envelopment analysis to examine bank efficiency in Central and Eastern Europe. These include for example Grigorian and Manole (2006), who study 17 European transition countries, Jemric and Vujcic (2002), who look at Croatia, and Havrylchyk (2006), who studies Poland. In accordance with the findings of the stochastic frontier literature, all studies find that foreign banks are more efficient than domestic ones. Grigorian and Manole (2006) find in addition that privatization does not automatically lead to higher efficiency, which is in line with Bonin et al. (2005a). This superior efficiency of foreign banks is however not necessarily found in other emerging market economies. Sensarma (2006) finds for India that foreign banks are less efficient than either public or private domestic banks.

Two studies investigate bank efficiency in Russia. Fries and Taci (2005) study the cost efficiency of banks from 15 post-communist countries including Russia between 1994 and 2001. They apply the one-stage Battese and Coelli (1995)'s stochastic frontier model and find that foreign ownership and private ownership are both associated with greater efficiency. Their findings, however, are based on a cross-country sample and need, therefore, not equally hold for every country. This observation is particularly relevant for Russia given their very limited sample of Russian banks (48 out of more than 1000 existing banks).

Styrin (2005) solves these problems by using a large dataset of Russian banks obtained from the Central Bank of Russia for the period 1999-2002. While efficiency scores are estimated in a first stage with the stochastic frontier approach, they are regressed on a set of potential determinants including public ownership and foreign ownership in a second stage.

Public ownership is innovatively defined as the actual affiliation with the state measured by the ratio of interest income received from the government to total interest income. This paper concludes in favor of a better efficiency of foreign banks, whereas public ownership is not significant to explain efficiency. The econometric two-stage approach and the exclusion of physical capital from the list of inputs are the paper's major limitations.

We use a similar dataset extended to 2006 and adopt the one-stage approach proposed by Battese and Coelli (1995) to investigate the cost efficiency of Russian banks. Next to solving the limitations of previous studies we contribute to the literature by studying whether the introduction of generalized deposit insurance had any effects on banks' comparative efficiency.

# 3. History and problems of the Russian banking sector

The privatization of Russia's former 'spetsbanki' was a relatively uncontrolled process that started before 1990 -the official start of bank privatization process- and was largely accomplished by the end of 1991, when the Soviet system collapsed. This secessionist privatization yielded a few large successors (Sberbank, Vneshtorgbank, Mosbiznesbank, Promstroibank and SBS-Agro) and more than 600 relatively small successors. Most of these were reluctant to restructure, as mirrored in higher costs, higher loan rates, poorer loan quality and smaller capital buffers (see Schoors, 2003). Not surprisingly most of the smaller successors faltered in the period 1995-1998. In the aftermath of the August 1998 crisis the larger successors were also swept away, with the notorious exceptions of Sberbank and Vneshtorgbank which survived as daughters of the CBR and now control a considerable part of the Russian banking market<sup>4</sup>. At present, the vast majority of Russian banks are unburdened by lingering Soviet deficiencies: most private banks are de novo banks -the privatized 'spetsbanki' faltered in the period 1992-1999-, while most public banks have been created after the collapse of the Soviet Union by government bodies like state enterprises, cities and federal, regional or local governments (see Tompson, 2004 and Vernikov, 2007). In our sample we count 25 of the latter category. Still, the banking sector has been faced with a number of serious problems throughout its history.

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<sup>&</sup>lt;sup>3</sup> In 1987 the Soviet Union turned its monobank system into a kind of two tier banking system with a embryonal central bank (Gosbank) and specialized 'commercial banks'. These were Sberbank (the savings bank), Promstroibank (industry and construction), Zhilsotsbank (housing and communal financing), Agroprombank (Agriculture) and Vneshtorgbank.(foreign trade). These specialized banks are commonly referred to as 'spetsbanki'.

<sup>&</sup>lt;sup>4</sup> In its 2005 Annual Report, Sberbank claims it holds 54.2% of total retail deposits, 44.1% of consumer loans, 32.2% of corporate loans, 16.6% of government securities and 26.5% of total Russian banking assets. The share in ruble-denominate retail deposits is even higher with more than 70%.

Early in transition, banks clearly preferred speculation to lending (Schoors, 2001). Bank lending to the non-financial sector shrank year after year as a share of total banking assets until 1999. In 2003, bank loans to the non-financial sector only amounted to just 17.0% of GDP and financed as little as 4.8% of fixed investment.<sup>5</sup> Since then the situation has improved. This reluctance to lend seems rational with hindsight. The presence of soft legal constraints (Perotti, 2002) rendered the enforcement of overdue claims difficult to impossible. Bank lending was further depressed by huge information asymmetries between banks and their prospective customers, and by the lack of screening and monitoring skills in the banks themselves and the economy at large. Banks were therefore unable to identify good potential borrowers (Brana, Maurel and Sgard, 1999), and often preferred not to lend at all. Moreover, the vast amount of tiny banks and the lack of a transparent information system about credit histories may have contributed to depressing lending (Pyle, 2002).

The largest part of the lending went to connected agents, regardless of the viability of the lending project, and with only very weak monitoring incentives (Laeven, 2001). Many of the newly founded private banks were captured by their owners. Such "pocket banks" operated as treasuries for a firm or a group of firms rather than independent banks. Note that the government, too, is to some extent a connected party, because several banks are captured by local, regional, or national governments. At the start of 2003, federal or regional authorities held majority stakes in 23 banks, the regional authorities held minority stakes in several more banks and a large number of state enterprises were part-owners of banks (Tompson, 2004).

The average loan quality was negatively affected by the combined problems of connected lending, soft legal constraints, information asymmetries and the lack of screening and monitoring skills. A leaked analysis of Russian banks after the crisis of August 1998 shows that the major cost for banks was not the devaluation loss or the government default on treasury bills, but bad loans hidden and accumulated during the preceding period. Schoors and Sonin (2005) explain how the Russian banking system was stuck in a passivity trap, where it is rational for each individual bank to hide bad loans rather than collecting them. Economic growth after 2000 allowed Russian banks to 'grow' out of bad loans, but the problem of loan quality is still a latent threat to the Russian banking system.

The Russian banking sector has in the past suffered from poor capitalization, especially considering the poor quality of assets and the large exposure to exchange rate risk. This overexposure was revealed when the devaluation in August 1998 sent capital of many Russian banks from positive to negative overnight (Perotti, 2002). The CBR has steadily tightened capital standards since 1999 and Claeys and Schoors (2007) show that these standards are indeed enforced. As a result capital levels have reached more acceptable levels. Still our data reveal that the average capitalization of the Russian banks is substantially higher

<sup>&</sup>lt;sup>5</sup> Data from the CBR Bulletin of Bank Statistics.

<sup>&</sup>lt;sup>6</sup> See 'The newly-wed and the nearly dead', Euromoney, June 1999.

than the weighted average capitalization, implying that the capital buffer is lower in the banks that are most important for systemic stability.

The institutional stability of Russian banks has proven weak with systemic problems in 1994, 1995, 1998 and 2004. Since 1992, more than 2000 Russian banks were liquidated or vanished. Sometimes this was due to a combination of the above-mentioned factors (poor capitalization, excessive speculative risk, endemic bad loans, connected lending, etc.), but there were also several cases of Ponzi schemes where crooks cheated depositors and fled with their money. In the aftermath of the August 1998 crisis it became apparent that the soft legal constraints faced by banks encouraged asset stripping and left creditors to bear the brunt of the cost of failure (Perotti, 2002). Claeys and Schoors (2007) give an overview of the CBR's relatively weak prudential supervision and control during the first decade and show that a policy rule-based enforcement of bank standards is difficult for the CBR because of conflicts with systemic stability concerns. Depositors reacted to this widespread institutional instability by either disciplining their banks in a sophisticated way<sup>7</sup> (Karas, Pyle and Schoors, 2006) or fleeing to the safe heavens of Sberbank and Vneshtorgbank that –like all public banks- were covered by an implicit state guarantee<sup>8</sup> (see OECD, 2004). Figure 1 shows how Sberbank's share of private deposits<sup>9</sup> reached a peak of close to 80% in 1998.

The government wanted to restore some competition in the deposit market and reacted by providing a form of partial deposit insurance. The federal law on deposit insurance was introduced in 2003, but the system became only operational in September 2004<sup>10</sup>. Sberbank was initially exempted and kept its full state guarantee until the 1st of January 2007, when it finally became subject to the new deposit insurance scheme. Other regulatory advantages of Sberbank (for example lower required reserves on ruble deposits) were also abolished. This gradually more level playing field ensured that Sberbank's share of private deposits gradually fell during the last five years to a still very high level of about 50% in 2006 (see figure 1).

In table 1 we summarize some of the crucial indicators of the recent developments of the Russian banking system. By early 2006 there were 1253 banks, among which only 1045 money deposit banks (covered by the deposit insurance scheme) with 3295 bank branches. More than 30% of these bank branches were however still operated by Sberbank, such that the average bank had about two branches. Clearly the average Russian bank is tiny when compared to European or world standards. By 2006 the Russian market counted 62 majority

<sup>&</sup>lt;sup>7</sup> By interpreting very high promised deposit rates as a proxy of institutional instability.

<sup>&</sup>lt;sup>8</sup> Sberbank has a huge branch network and carries a government guarantee. The government lent credibility to this guarantee by supporting Sberbank when needed and using it as a device to absorb deposits from large defunct deposit banks in the aftermath of the 1998 crisis. The same holds for Vneshtorgbank as demonstrated in the mini-crisis in May–July 2004, when Vneshtorgbank acquired Gutabank, one of the larger deposit banks under attack. As a result, Sberbank and Vneshtorgbank continue to dominate a highly concentrated deposit market.

<sup>&</sup>lt;sup>9</sup> Both ruble- and foreign currency-denominated private deposits.

<sup>&</sup>lt;sup>10</sup> Although an unrelated and opaque form of state guarantee was already granted to all banks in July 2004 to stop the evolving banking panic.

foreign-owned banks, but their branch network was still relatively underdeveloped. On the other hand banking has clearly revived during the last five years, with bank lending rising from 17% of GDP in 2001 to 32% of GDP in 2006 and private deposits rising from 8% of GDP to 14% of GDP over the same period. Average interest rates seem still high in nominal terms but are low once inflation is taken into account. Clearly Russian banks are increasingly playing their role as effective intermediaries between savings and investments, but the banking system still suffers from the predominance of tiny banks with underdeveloped branch network, excessive concentration and lack of foreign competition. Although private deposit collection is growing it remains far behind corporate lending.

#### 4. Data and variables

The quarterly bank balances and profit and loss accounts were made available to the authors by the financial information agency Interfax<sup>11</sup>. The chosen sample periods (2002 and 2006) are convenient to properly detect longitudinal effects of private ownership. Brown et al (2006) find that positive effects of domestic privatization appear immediately in Hungary, Romania, and Ukraine, but emerge only five years after privatization in Russia. In our study almost all remaining banks are de novo banks and the few remaining privatized banks are considered 10 years or more after privatization, so any positive efficiency effects are expected to have appeared by then.

The panel is unbalanced because some banks fail, some merge, and some are founded during the sample period. If a bank merged or was acquired we treat the resulting larger bank as "new". To identify foreign banks, we use the quarterly lists of 100% foreign-owned banks provided by the CBR since 1999. The lists of banks with the state as a majority owner are available at two points in time, February 1, 2002 (Matovnikov, 2002) and July 1, 2005 (Mamontov, 2005). These lists reveal that the state ownership category remains stable over our sample period.

We perform estimations before (2002) and after (2006) the introduction of deposit insurance in 2004. For each sub-period, we use a balanced panel which is more convenient for the application of the Battese and Coelli (1995)'s model. As efficiency scores are relative measures of performance, we need to have comparable banks in terms of practiced activities. We therefore only keep banks with both shares of deposits and loans in total assets greater than 10%. Our final sample consists of 747 banks (including 19 public banks and 26 foreign banks) for 2002 and 471 banks (including 15 public banks and 20 foreign banks) for 2006.

The literature disagrees on the role of deposits in the production process of banks. The classical production approach treats deposits and loans as outputs and labor and physical

<sup>11</sup> Karas and Schoors (2005) provide a detailed description of the dataset and confirm its consistency with other data sources.

capital as inputs. The intermediation approach first used by Sealey and Lindley (1977) views banks as intermediaries between savings and investments in the economy and treats earning assets as outputs and deposits as inputs.

The weak development of financial markets makes a clear focus on the lending and deposit activities of banks relevant for Russia. Therefore we tend to prefer the production approach in this paper. The intermediation approach has the disadvantage that deposits are neglected as an important output. There exists also an argument in favor of the intermediation approach though. Public and foreign banks might have access to cheaper funding if depositors believe those banks to possess additional protection compared to private domestic banks. Public banks have enjoyed the explicit state guarantee backing their retail deposits, which was scrapped only at the end of 2003. In addition their cost of funds is reduced by the perception that the state will stand behind them (Tompson, 2004). Foreign banks' deposits may also enjoy an implicit (by the mother bank) or an explicit deposit guarantee (in some countries clients of foreign branches of domestic banks are covered under the national deposit insurance scheme). Such guarantees, be they perceived or real, could affect input prices for deposits, but this is not considered in the production approach, because the deposit cost is not included in the measure of total costs. This gives a rationale for the use of the intermediation approach, that considers deposits as an input rather than an output and that includes the cost of deposits in the measure of total costs. In robustness checks, we will substitute the intermediation for the production approach. Our results are however robust to the choice of the production process. This is not unexpected given the finding of Wheelock and Wilson (1995) and Berger et al. (1997), that the choice of the approach may have a considerable impact on the level of the efficiency scores but not on their rankings.

For the production approach, the output variables are total deposits and total loans. The input prices are the price of physical capital, measured by the ratio of other operating expenses to fixed assets, and the price of labor, measured by the ratio of personnel expenses to total assets<sup>12</sup> as data on the number of employees is not available (Altunbas et al. 2000, Weill, 2003). As observed by Maudos et al. (2002), the latter ratio can be interpreted as labor cost per worker (personnel expenses to number of employees) adjusted for differences in labor productivity (number of employees to total assets), since it is the product of these ratios. Total costs are the sum of personnel expenses and other operating expenses. Controls for environment, risk preferences and activities mix include seven geographical district dummies, the log of total assets, the log of equity, the share of bad loans in total loans, and the percentage breakdown of banks' total deposits and loans by counterpart (households, firms, government, banks).

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<sup>&</sup>lt;sup>12</sup> We use the Tukey box-plot to detect outliers: for each input price we drop observations lying out of the range defined by the first and third quartile minus/plus two times the interquartile range.

For the intermediation approach, the output variables are total loans and total securities, while the input prices are the deposit rate (measured as the ratio of interest paid on deposits to interest bearing deposits), the price of physical capital (as defined before), and the price of labor (as defined before). Total costs are the sum of interest paid on deposits, personnel expenses and other operating expenses.

Table 2 compares the means of key variables of private and public banks. Table 3 does the same for domestic and foreign banks. Both public and foreign banks are much bigger, slightly less capitalized and more frequently located in the Moscow area relative to their counterparts, respectively, private and domestic banks. These patterns are more pronounced in the second sub-period. Compared to private banks, public banks grant relatively more loans to companies and banks and relatively less loans to households. Not surprisingly, public banks rely relatively more on the government as a source of funding. Foreign banks are extremely active on the interbank market, both in terms of borrowing and lending, while domestic banks are predominantly occupied with core activities: granting loans to companies and individuals and collecting core deposits. For all bank categories household deposits have become a much more important source of funding over time.

## 5. Methodology

This section develops the methodology adopted to estimate cost efficiency of Russian banks. Cost efficiency measures how close a bank cost is to what a bank optimal cost would be for producing the same bundle of outputs. It then provides information on wastes in the production process and on the optimality of the chosen mix of inputs.

Several techniques have been proposed in the literature to measure efficiency with frontier approaches. While nonparametric approaches, e.g. DEA, use linear programming techniques, parametric approaches, such as stochastic frontier approach or distribution-free approach, apply econometric tools to estimate the efficiency frontier. We adopt stochastic frontier approach in our study, following many studies on banking efficiency in transition countries (Weill, 2003; Bonin et al., 2005a; Fries and Taci, 2005). In comparison to DEA, this approach presents the advantage to disentangle inefficiency from a statistical noise taking exogenous events into account in the residual (the distance from the efficiency frontier). In section 7 we also present DEA estimates as additional robustness checks.

The stochastic frontier approach assumes that total cost deviates from the optimal cost by a random disturbance, v, and an inefficiency term, u. Thus the cost function is  $TC = f(Y, P) + \varepsilon$  where TC represents total cost, Y is the vector of outputs, P the vector of input prices and  $\varepsilon$  the error term which is the sum of u and v. u is a one-sided component representing cost inefficiencies, meaning the degree of weakness of managerial performance. v is a two-sided component representing random disturbances, reflecting luck or

measurement errors. u and v are independently distributed. u is assumed to have a truncated normal distribution, while v is assumed to have a normal distribution.  $\sigma v^2$  and  $\sigma u^2$  are the respective variances of u and v. According to Jondrow et al. (1982), firm-specific estimates of inefficiency terms can be calculated by using the distribution of the inefficiency term conditional on the estimate of the composite error term.

The more straightforward procedure is the so-called "two-stage procedure": the stochastic frontier model is estimated in the first stage, while the obtained efficiency scores are regressed on a set of explanatory variables including ownership variables in the second stage. Although often applied in the literature, this two-stage procedure presents two important econometric problems, as observed by Kumbhakar and Lovell (2000). First, it assumes that the efficiency terms are identically distributed in the estimation of the stochastic frontier model of the first stage, while in the second stage this assumption is contradicted by the fact that the regression of the efficiency terms on the explanatory variables suggests that the efficiency terms are not identically distributed. Second, the explanatory variables must be assumed as uncorrelated with the variables of the cost frontier function, or else the maximum likelihood estimates of the parameters of the cost frontier function would be biased because of the omission of the explanatory variables in the first stage. But then, the estimated efficiency terms that are explained in the second stage are biased estimates, as they are estimated relative to a biased representation of the cost frontier.

Therefore, we choose to use the "one-stage procedure" proposed by Battese and Coelli (1995), which solves these econometric problems. They propose a procedure for panel data, in which the non-negative inefficiency term is assumed to have a truncated distribution with different means for each firm. As a result, the distributions of the inefficiency terms are not the same, but are expressed as functions of explanatory variables. The inefficiency terms are then independently but not identically distributed. They are obtained by truncation at zero of the  $N(\mu_{ii}, \sigma u^2)$  distribution:  $\mu_{ii} = z_{ji} \delta$ , where  $z_{ji}$  is a vector of explanatory variables, and  $z_{ii}$  is a vector of parameters to be estimated.

The estimated model consists of the cost frontier function and an equation explaining inefficiency. As is common in the literature on bank efficiency in transition countries (Weill, 2003, Bonin et al., 2005a, Fries and Taci, 2005) we use a standard translog specification of the cost frontier:

$$\begin{split} \ln \left( \frac{TC_{i,t}}{pk_{i,t}} \right) &= \beta_0 + \sum_m \alpha_m \ln y_{m,i,t} + \frac{1}{2} \sum_m \sum_j \alpha_{mj,i,t} \ln y_{m,i,t} \ln y_{j,i,t} + \beta_1 \ln \left( \frac{pl_{i,t}}{pk_{i,t}} \right) \\ &+ \beta_2 \left[ \ln \left( \frac{pl_{i,t}}{pk_{i,t}} \right) \right]^2 + \sum_m \gamma_m \ln \left( \frac{pl_{i,t}}{pk_{i,t}} \right) \ln y_{m,i,t} + \epsilon_{i,t} \end{split} \tag{1}$$

where TC total cost,  $y_m$  m<sup>th</sup> bank output (m=1,2), pl price of labor, pk price of physical capital,  $\varepsilon$  the composite error term. Inefficiency is a function of bank-specific variables:

$$\mathbf{u}_{it} = \delta \mathbf{z}_{it} + \mathbf{W}_{it} \tag{2}$$

where  $u_{ii}$  is the inefficiency,  $z_{ii}$  is a p\*1 vector of explanatory variables,  $\delta$  is a 1\*p vector of parameters to be estimated,  $W_{ii}$  is a random variable defined by the truncation of the normal distribution with mean zero and variance  $\sigma^2$  ( $\sigma^2 = \sigma_{ii}^2 + \sigma_{ii}^2$ ). We use the software program Frontier 4.1 to perform the maximum likelihood estimation of the cost frontier.

#### 6. Results

We estimate the efficiency model for the period before generalized deposit insurance (2002) and after generalized deposit insurance (2006) to check whether the implementation of the deposit insurance has modified the differences in efficiency between banks with different types of ownership. In all estimations, we include bank ownership variables in the equation explaining inefficiency. Two alternative definitions of public ownership are employed. On the one hand, we include a dummy variable taking the value of one whether the bank is publicly-owned. On the other hand, following Styrin (2005), we measure public ownership by the ratio of interest income received from the government to total interest income. Foreign ownership is taken into account through a dummy variable equal to one whether the bank is foreign-owned.

#### Insert table 4 around here

Table 4 describes the main results. While Panel A presents the results when public banks are defined according to the ownership, panel B presents those when public banks are defined according to their activities. In the interpretation, one has to keep in mind that the econometric model identifies inefficiency. Therefore a minus sign indicates that an increase in the explanatory variable implies lower inefficiency, i.e. higher efficiency.

The baseline specification (a) of panel A shows that foreign banks are more efficient than domestic private banks and public banks, and that public banks are more efficient than domestic private banks after the introduction of deposit insurance. Indeed, while the estimates for public ownership are negative and insignificant in specification (a), specification (d) indicates that the efficiency gap between public banks and domestic private banks becomes significant after the introduction of generalized deposit insurance. In an economic sense, the found efficiency differences are considerable. This is also true in panel B where public banks are identified according to their activities rather than their ownership.

In the baseline specifications (a) and (d), we implicitly assume that bank's environment (determined by its location) and risk preferences are management choices. One could however argue that environment is exogenous to management decisions. Consequently, the influence of environment should be disentangled to have a satisfactory measure of bank efficiency. In this strand of literature, Dietsch and Lozano-Vivas (2000) have notably shown that environment may explain the cross-country differences in bank efficiency. Furthermore, Hugues and Mester (1993) and Mester (1996) have shown that efficiency differences may also come from differences in managers' risk preferences. Indeed the degree of risk aversion has an impact on cost efficiency. Risk-loving managers may keep the capital down to its costminimizing level (the regulatory threshold), while risk-averse managers may prefer to hold higher levels of capital. Consequently, by omitting the level of equity in the cost frontier, we may consider a bank as inefficient while it behaves optimally given the risk preferences of its managers. Berger and Mester (1997) provide an additional reason to include the level of equity into the estimation of the cost efficiency model, based on the fact that the insolvency risk of the bank depends on the equity available to absorb losses. This insolvency risk may lead to higher bank costs<sup>13</sup>. This issue has a particular importance in transition economies like Russia where the insolvency risk of banks is not negligible.

In specifications (b) before generalized deposit insurance and (e) after generalized deposit insurance, we therefore include some environmental variables in the cost frontier. We use information on the district of the bank, taking into consideration the geographical breakdown of Russia in 7 districts. We therefore include 6 dummy variables, which are equal to one whether the bank is located in the concerned district, in the cost frontier. In specifications (c) and (f), we include the logarithm of equity in the estimation of the cost frontier to control for risk preferences in addition to environmental variables, following notably Mester (1996), Altunbas et al. (2000) and Weill (2003). All these specifications show that the baseline results are very robust. Foreign banks remain consistently the most efficient ones and public banks remain consistently more efficient than domestic private ones.

This first set of results suggests that in Russia public banks are more rather than less efficient than domestic private banks. This is in accordance with Styrin (2005) but differs from Fries and Taci (2005). Note however that the latter study obtained results on a cross-country sample from 15 transition countries including only a very limited sample of Russian banks. In addition, our results surprisingly suggest this efficiency advantage was enhanced rather than reduced by the implementation of the deposit insurance scheme.

Since the results in table 4 do not take into account the possible effect of systematic differences in the deposit rate<sup>14</sup>, table 5 repeats the regressions of table 4, applying the intermediation approach instead of the production approach. In the intermediation approach

<sup>&</sup>lt;sup>13</sup> In our framework, higher solvency risk could affect the costs of the considered cost function through higher labor costs and higher costs of physical capital (to convince depositors to lay out their deposits, banks with lower capital need to invest more in their branch network).

<sup>&</sup>lt;sup>14</sup> Public banks could have systematically lower deposit rates than private banks.

the deposit rate is an input cost in the cost function and the total deposit cost is included of the measure of total cost.

#### Insert table 5 around here

The estimates in table 5 indicate that our unexpected results are very robust to the choice of a production process. Applying the intermediation approach, we again find that foreign banks exhibit superior efficiency, that public banks tend to be more efficient than domestic private banks and that the latter efficiency gap becomes statistically significant after the introduction of deposit insurance. It is suggested therefore that the superior efficiency of public over private banks is not an inheritance of some communist past, but a fact of contemporaneous Russian banking markets.

One explanation for this puzzle could be that public and private banks have different sets of activities and that the typical activity mix of public banks involves fewer costs than the one typically exerted by private banks. In table 6, we test this idea by including measures of the activity mix in the equation explaining inefficiency.

#### Include table 6 around here

In each panel of table 6, we consider the activity mix in the form of lending and deposit shares by type of customer (households, firms, government, bank) and the average loan quality (measured as the ratio of classified loans to total loans). <sup>15</sup> In panels A and B we apply the production approach, in panels C and D the intermediation approach. Panels A and C identify public banks through ownership, while panels B and D identify public banks through revealed activities with the government. In each panel we have 4 specifications. In specification (a) we include the regional dummies in the estimation of the efficient frontier and all the activity mix variables in the equation explaining inefficiency. In specification (b) we additionally include equity in the estimation of the efficient frontier. In specification (c) we include the regional dummies and the activity mix variables in the estimation of the efficient frontier, leaving only the loan quality as explanatory variable for the residual inefficiency. In specification (d) we include the regional dummies, equity and the set of activity mix variables in the estimation of the frontier, again leaving only loan quality as explanatory variable for the residual inefficiency. Our three main results are very robust to all these exercises. Foreign banks are again more efficient than domestic private banks. Public banks tend to be more efficient than domestic private ones. This effect seems to be stronger after than before the introduction of deposit insurance. Moreover some results become stronger rather than weaker in some cases. In panel A for example (production approach,

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<sup>&</sup>lt;sup>15</sup> Since the bank share and the government share are zero for many banks, their sum is the omitted variable for both lending and deposits. The results do not change if households or firms are the excluded category instead.

public ownership), the public banks superior efficiency now becomes statistically evident even in pre deposit insurance period. In panel C (intermediation approach, public ownership) the public banks become less inefficient than even the foreign banks in the predeposit insurance period.

#### 7. Further robustness checks

The summary statistics in table 2 indicate that public banks are on average very large compared to domestic private banks. If scale economies are present in the Russian banking sector, these considerable size differences may explain our results. Note however that there are also arguments to hypothesize large Russian private banks may be less efficient than their smaller competitors. Claeys and Schoors (2007) find that large Russian banks enjoy regulatory forbearance from the part of the Central bank of Russia. This form of soft legal constraints implies that managers of larger banks are subject to less regulatory pressure. This gives the managers concerned more degrees of freedom to maximize their private benefits of control, which may come at the cost of lower efficiency. To control the effect of size we repeat our estimations for a size matched sample. The matching procedure for the two subperiods runs as follows:

- 1. We exclude the largest public banks, Sberbank, Vneshtorgbank and Gazprombank from the two samples. They dominate the market and their special status (see above) may drive the results.
- 2. For each of the remaining public banks, we identify in each time period 20 size-matched (size in terms of total assets) private domestic banks. Specifically, we draw the closest 10 larger and the closest 10 smaller private domestic banks that have not been drawn yet in the specific period. This yields two lists of matching banks, one for the sample before deposit insurance and one for the sample after deposit insurance.
- 3. Finally we make the sample balanced, by dropping all banks that fail to show up in all 4 quarters of the sub-period.

This procedure yields ultimately 123 matching private domestic banks before deposit insurance (or 492 bank observations) and 141 matching private domestic banks after deposit insurance (or 564 bank observations). All foreign banks are retained in the sample. In annex A.1 we present the summary statistics of this matched sample. One observes that the size differences are now substantially smaller than in the full sample of table 2.

### Insert table 7 around here

In table 7, we repeat the estimations with all possible controls of panel A in table 6. In annex A.2 we show the reproduced estimations with the size-matched datasets from the

remaining panels of table 6. Our three main findings are robust but the estimated efficiency gap becomes smaller in most specifications. The public bank variable remains consistently negative in all specifications of all panels although its significance falters in some specifications of the intermediation approach (see Annex A.2). Apparently the observed efficiency gap between public and private banks is not only driven by size differences or by the special position enjoyed by the CBR-owned large public banks, but also by some genuine efficiency differences.

As a further robustness check we employed a two-stage DEA procedure. In the first stage we estimate time specific bank efficiency scores for each quarter. We use the quarterly efficiency scores for each bank to compute each bank's mean efficiency scores for each year (2002 before the reform, 2006 after the reform). In a second stage, we regress these mean efficiency scores on a set of determinants (public ownership, foreign ownership, activity) using a Tobit estimator. This exercise was performed both on the full and the size-matched sample. Results of the second stage Tobit regressions are presented in table 8. Note that DEA is a totally different estimation strategy, often leading to quite different results. The interpretation of the signs is now different, since DEA measures efficiency rather than inefficiency and since the estimates are time-specific rather than panel estimates.

#### Insert table 8 around here.

In table 8 we observe that foreign banks are again found to be more efficient than domestic banks. The efficiency of publicly owned banks is never significantly different from that of private banks. The introduction of deposit insurance seems again to be affecting efficiency differences in favor of the foreign banks and the public banks. In the case of publicly owned banks, the signs of the estimates change from insignificantly negative in 2002 to insignificantly positive in 2006.

#### 8. Concluding remarks

In the Russian banking market we document three very robust results with respect to bank efficiency. Foreign banks are more efficient than domestic private banks (no surprise), domestic private banks are not more efficient than public banks (surprise) and the introduction of deposit insurance increased any existing efficiency gap between public and private banks (big surprise). These results are not driven by the choice of the production process, environment, risk preferences, activity mix, size or econometric approach.

This result of foreign banks' superior efficiency is in accordance with most literature on this topic in transition countries. Namely, Weill (2003), Fries and Taci (2005) and Bonin et al. (2005a) conclude similarly on samples of banks from various transition countries. This

finding is also very robust to the specifications taking environment, equity, size and structure of activities into account. It may find its origin in both reasons proposed by Weill (2003). On the one hand, most shareholders of foreign banks are themselves banks. Consequently these shareholders can provide their know-how in organization and risk analysis to their subsidiaries. On the other hand, foreign banks would benefit from better corporate governance as shareholders originating from Western economies would be more used to monitoring bank managers.

But why are private banks not more efficient than public banks in Russia? This unexpected finding is neither in accordance with the general prior that public ownership is less efficient than private ownership, nor with the findings of Bonin et al. (2005a) and Fries and Taci (2005) on cross-country samples of banks from Central and Eastern European countries. Implicit state guarantees may have rendered Russia's public banks' access to deposits less costly in terms of labor and physical capital resulting in higher efficiency. A greater depositor base may in turn lead to a greater pool of loan applicants. Therefore, public banks may also benefit from granting a higher amount of loans than private banks for the same level of costs, because they have to provide fewer efforts to find lenders. But if this explanation is true, the creation of a more level playing field by the introduction of a generalized deposit insurance scheme, no matter how incomplete, should have mitigated the efficiency difference, while we found that the opposite is true. So this explanation must be abandoned. Still deposit insurance may have played a role through moral hazard. There is strong evidence that Russian private domestic banks were subject to strong and sophisticated market discipline before the introduction of deposit insurance (see Karas, Schoors and Pyle, 2006). This forced them in the direction of more efficiency. The introduction of deposit insurance may however have reduced the pressure coming from market discipline, without replacing it with sufficiently strong regulatory pressure. In short, the introduction of deposit insurance may have introduced moral hazard, leading to more rather than less inefficient management practices of private banks.

Alternatively, the observed increase in the efficiency gap between public and private banks may be due to the existence of increased switching costs (see Kim et al., 2003). These switching costs notably derive from costs linked to the time and effort to close an account and open it elsewhere, to become comfortable with unfamiliar procedures and new bank employees, and from costs related to the loss of capitalized value of established relationships. Switching costs may also endogenously result from the fact that banks benefit from better information on their clients than competitors (Sharpe, 1990; Rajan, 1992). The widespread trust in public banks accumulated through their long dominance of the Russian retail markets and the renewed distrust in private banks after the 'mini-crisis' of May-July 2004 (see above) may have increased switching costs from public to private banks. Stronger even, the several weeks of turbulence on the Russian inter-bank market triggered by the CBR's intervention in the case of a bank accused of money-laundering, hampered depositor trust in

the banking system and led to the "flight to quality" - the shift of deposits from private to public banks.

Given the fact that Russian public banks are not more inefficient than private ones, the large state presence in the Russian banking sector is not necessarily the cause of its relative inefficiency with the well-known corollaries of lower credit levels and higher financial instability. The implication is that bank privatization will not necessarily improve the efficiency of the Russian banking system. Since the main inefficiency seems to reside with domestic private banks, the system's efficiency may benefit more from increased competition than privatization. This can be achieved by creating a more level and more stable regulatory playing field for all banks, an objective the CBR is making progress with, and by opening the market to foreign competition. In this light, the CBR's relentless efforts of the last years (2006-2007) to get rid of inefficient and fraudulent banks regardless of their size and the increasing access of foreign banks to the Russian banking sector may be more instrumental in boosting the sector's efficiency than yet another round of chaotic privatization.

<sup>&</sup>lt;sup>16</sup> These efforts are deeply resented by some of the banks concerned that fear to loose their license and culminated in the brutal murder of the Mr. Kozlov, vice president of the CBR in charge of bank licensing policy in October 2006. The CBR reacted by reinforcing its effort to sweep though the banking licenses.

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Table 1: Some Indicators of recent developments in the Russian banking sector

Data are at the start of period unless indicated otherwise	2001	2002	2003	2004	2005	2006
Number of credit organizations	2126	2003	1828	1668	1518	1409
with banking license	1311	1319	1329	1329	1299	1253
license to attract private deposits	1239	1223	1202	1190	1165	1045
license to conduct foreign currency operations	764	810	839	845	839	827
general license	244	262	293	310	311	301
license for operations with precious metals	163	171	175	181	182	184
Foreign credit organizations with banking license	130	125	126	128	131	136
fully foreign owned	22	23	27	32	33	41
50 to 100% foreign owned	11	12	10	9	9	11
Total number of branches	3793	3433	3326	3219	3238	3295
of which branches of Sberbank	1529	1233	1162	1045	1011	1009
of which branches of fully foreign owned banks	7	9	12	15	16	29
Corporate Lending/GDP (eop)	17%	19%	22%	25%	27%	32%
Private deposits/GDP	8%	10%	11%	12%	13%	14%
Lending/Gross fixed capital formation (eop)	92%	105%	120%	137%	149%	177%
Inflation (eop)	18.6%	15.1%	12.0%	11.7%	10.9%	9.0%
Deposit rate (period average)	4.9%	5.0%	4.5%	3.8%	4.0%	4.1%
Lending rate (period average)	17.9%	15.7%	13.0%	11.4%	10.7%	10.5%

Sources: Rosstat, CBR and International Financial Statistics (IMF).

Lending was defined of lending of deposit money banks to private and public enterprises, excluding financial companies.

Table 2: Means of key variables between private and public banks

	20	02	2006		
	Private banks	Public banks	Private banks	Public banks	
Characteristics					
Total assets	1,213.56	17,585.80	2,934.71	160,481.92	
Total costs (production)	49.26	593.51	142.65	6,575.91	
Total costs (intermediation)	57.90	696.50	168.36	7,941.45	
Loans	901.67	12,400.59	2,182.47	118,575.98	
Deposits	855.46	9,406.17	2,278.33	127,781.46	
Investment assets	73.60	2,283.15	380.68	29,776.67	
Price of labor	0.0106	0.0105	0.0102	0.0078	
Price of physical capital	1.8113	1.5108	1.8488	2.0085	
Price of borrowed funds	0.0111	0.0089	0.0121	0.0110	
Equity/total assets	0.2726	0.2348	0.1837	0.1297	
Bad loans / loans	0.0184	0.0247	0.0189	0.0114	
Loan activities					
Household loans / loans	0.0790	0.0232	0.1915	0.1474	
Firm loans / loans	0.6649	0.6622	0.6292	0.6654	
Government loans / loans	0.0108	0.0104	0.0066	0.0181	
Bank loans / loans	0.2453	0.3042	0.1726	0.1691	
Deposit activities					
Household dep./ deposits	0.2285	0.1267	0.4180	0.3526	
Firm deposits / deposits	0.6080	0.5889	0.4796	0.3888	
Government dep. /deposits	0.0262	0.1298	0.017	0.1232	
Bank dep. / deposits	0.1373	0.1547	0.0908	0.1355	
Environment					
Moscow area	0.5192	0.5789	0.3706	0.4667	
Number of observations	2912	76	1824	60	

Table 3: Means of key variables between domestic and foreign banks

	20	02	20	06
	Domestic banks	Foreign banks	Domestic banks	Foreign banks
Characteristics				
Total assets	1,385.31	8,414.93	7,521.01	17,674.06
Total cost (production)	55.35	277.95	332.89	677.80
Total cost (intermediation)	64.70	336.12	398.33	812.46
Loans	998.13	6,629.65	5,559.31	13,329.95
Deposits	860.11	6,975.06	5,902.71	14,675.99
Investment assets	111.20	645.49	1,243.35	2,974.54
Price of labor	0.0107	0.0077	0.0103	0.0073
Price of physical capital	1.7828	2.3836	1.8528	1.8800
Price of borrowed funds	0.0112	0.0088	0.0122	0.0096
Equity/total assets	0.2725	0.2462	0.1827	0.1677
Bad loans / loans	0.0184	0.0216	0.0172	0.0508
Loan activities				
Household loans / loans	0.0792	0.0337	0.1904	0.1838
Firm loans / loans	0.6718	0.4709	0.6360	0.5036
Government loans / loans	0.0112	0.0001	0.0073	0.0001
Bank loans / loans	0.2379	0.4954	0.1663	0.3125
Deposit activities				
Household dep./ deposits	0.2290	0.1401	0.4277	0.1498
Firm deposits / deposits	0.6150	0.4012	0.4809	0.3811
Government dep. /deposits	0.0299	0.0001	0.0159	0.0001
Bank dep. / deposits	0.1261	0.4585	0.0755	0.4691
Environment				
Moscow area	0.5118	0.7692	0.3503	0.9000
Number of observations	2884	104	1804	80

Table 4: The inefficiency of public banks according to the production approach

	Before gene	eralised deposit insura	nce (2002)	After gene	eralised deposit insura	ance (2006)
Frontier characteristics	(a) Baseline	(b) environment	(c) Equity and environment	(d) Baseline	(e) environment	(f) Equity and environment
Intercept	Yes	Yes	Yes	Yes	Yes	Yes
D1.1: - 11	-2.321	-2.346	-2.226	-2.915***	-3.527***	-1.924***
Public banks	(1.37)	(1.38)	(1.24)	(4.19)	(4.34)	(4.04)
D 1 1 1	-2.393*	-2.544***	-2.560	-6.325***	-6.594***	-4.788***
Foreign banks	(1.95)	(2.67)	(1.34)	(3.88)	(4.00)	(3.35)
Log-likelihood	-2203.909	-2192.782	-2189.672	-1278.612	-1270.417	-1200.630
Panel B: Public	c banks defined a	as banks that recei	ive a high share o	f interest incom	e from the govern	ment bodies
Intercept	Yes	Yes	Yes	Yes	Yes	Yes
•	-2.125	-2.357	-2.172	-3.398***	-3.633***	-2.903***
Public banks	(0.88)	(1.01)	(0.84)	(4.35)	(3.70)	(4.66)
E . 1 1	-2.370**	-2.535***	-2.550	-6.519***	-6.739***	-4.965***
Foreign banks	(1.97)	(2.80)	(1.54)	(3.31)	(3.30)	(2.95)
Log-likelihood	-2205.207	-2194.002	-2190.745	-1282.249	-1274.881	-1202.208

'Environment' means that regional dummies are included in the estimation of the cost frontier. 'Equity' refers to the inclusion of the bank's equity in the estimation of the cost frontier. N=2988 for the first period, N=1884 for the second period. Absolute t-statistics are displayed in parentheses, \*, \*\*, \*\*\* denote an estimate significantly different from zero at the 10%, 5% or 1% level.

Table 5: The inefficiency of public banks according to the intermediation approach

	Before generalised deposit insurance (2002)			After generalised deposit insurance (2006)			
Frontier characteristics	(a) Baseline	(b) environment	(c) Equity and environment	(d) Baseline	(e) environment	(f) Equity and environment	
Intercept	Yes	Yes	Yes	Yes	Yes	Yes	
D1.1: - 11.	-3.018	-2.801	-2.507	-2.886***	-3.268***	-1.994***	
Public banks	(1.60)	(1.58)	(1.35)	(4.01)	(2.90)	(4.10)	
E ' 1 1	-1.290**	-1.187*	-1.084**	-7.020***	-7.162***	-5.862***	
Foreign banks	(2.08)	(1.66)	(2.41)	(3.63)	(2.66)	(3.82)	
Log-likelihood	-1983.526	-1972.305	-1968.205	-1040.960	-1035.344	-1015.842	
Panel D: Public	c banks defined	as banks that rece	ive a high share o	of interest incom	e from the govern	ment bodies	
Intercept	Yes	Yes	Yes	Yes	Yes	Yes	
D 11' 1 1	-0.776	-1.387	-1.134	-3.888***	-4.243***	-2.968***	
Public banks	(0.53)	(0.85)	(0.74)	(3.54)	(3.80)	(4.52)	
E 1 1	-1.141	-1.071	-0.976	-7.093***	-7.240***	-5.943***	
Foreign banks	(1.17)	(1.13)	(1.58)	(3.02)	(3.37)	(4.21)	
Log-likelihood	-1986.681	-1975.090	-1970.917	-1042.721	-1037.439	-1016.970	

'Environment' means that regional dummies are included in the estimation of the cost frontier. 'Equity' refers to the inclusion of the bank's equity in the estimation of the cost frontier. N=2988 for the first period, N=1884 for the second period. Absolute t-statistics are displayed in parentheses, \*, \*\*, \*\*\* denote an estimate significantly different from zero at the 10%, 5% or 1% level.

Table 6. Robustness to differences in activity mix

Panel A: Public banks defined as state-owned bank/production approach

Pre generalised depe	osit insurance	e (2002)		
Frontier characteristics	(a) environment	(b) equity and environment	(c) environment and activities	(d) equity and environment and activities
Intercept	Yes	Yes	Yes	Yes
Public banks	-1.041**	-1.153***	-0.679**	-0.801**
	(2.04)	(3.06)	(2.03)	(2.23)
Foreign banks	-0.803***	-0.873***	-0.584**	-0.653
	(2.85)	(2.61)	(2.06)	(1.58)
Household deposits %	Yes	Yes	-	-
Firm deposits %	Yes	Yes	-	-
Household loans %	Yes	Yes	-	-
Firm loans %	Yes	Yes	-	-
Bad loans %	Yes	Yes	Yes	Yes
Log-likelihood	-2163.004	-2162.106	-2130.126	-2128.461
Post generalized dep	osit insuran	ce (2006)		
Intercept	Yes	Yes	Yes	Yes
Public banks	-2.699***	-1.739***	-5.397**	-2.859***
	(3.85)	(3.67)	(2.47)	(3.46)
Foreign banks	-4.514***	-3.885***	-7.153*	-5.523***
	(3.71)	(3.64)	(1.97)	(3.28)
Household deposits %	Yes	Yes	-	-
Firm deposits %	Yes	Yes	-	-
Household loans %	Yes	Yes	-	-
Firm loans %	Yes	Yes	-	-
Bad loans %	Yes	Yes	Yes	Yes
Log-likelihood	-1226;456	-1165.323	-1230.926	-1143.223

Panel B: Public banks defined as banks that receive a high share of interest income from the government bodies/ production approach

Pre generalised dep	osit insurance	e (2002)		
Frontier characteristics	(a) environment	(b) equity and environment	(c) environment and activities	(d) equity and environment and activities
Intercept	Yes	Yes	Yes	Yes
Public banks	-1.348	-1.561	-0.862	-1.137
	(1.24)	(1.58)	(0.95)	(1.53)
Foreign banks	-0.788***	-0.863**	-0.574**	-0.654*
	(2.89)	(2.52)	(2.05)	(1.70)
Household deposits %	Yes	Yes	=	-
Firm deposits %	Yes	Yes	-	-
Household loans %	Yes	Yes	-	-
Firm loans %	Yes	Yes	-	-
Bad loans %	Yes	Yes	Yes	Yes
Log-likelihood	-2163.432	-2162.537	-2130.490	-2128.775
Panel B Post genera	lized deposit	insurance (2006)		
Intercept	Yes	Yes	Yes	Yes
Public banks	-3.329***	-2.766***	-3.602	-2.855***
	(3.37)	(3.87)	(1.18)	(3.17)
Foreign banks	-4.553***	-4.001***	-5.611	-5.627**
	(3.35)	(3.63)	(1.39)	(2.43)
Household deposits %	Yes	Yes	=	-
Firm deposits %	Yes	Yes	-	-
Household loans %	Yes	Yes	-	-
Firm loans %	Yes	Yes	-	-
Bad loans %	Yes	Yes	Yes	Yes
Log-likelihood	-1231.047	-1167.378	-1235.123	-1145.789

Panel C: Public banks defined as state-owned banks / intermediation approach

Pre generalised depe	osit insurance	e (2002)		
Frontier characteristics	(a) environment	(b) equity and environment	(c) environment and activities	(d) equity and environment and activities
Intercept	Yes	Yes	Yes	Yes
Public banks	-1.285***	-1.259**	-1.471	-1.447*
	(2.31)	(2.36)	(1.58)	(1.93)
Foreign banks	0.005	0.018	-1.609	-0.155
	(0.02)	(0.11)	(0.51)	(0.81)
Household deposits %	Yes	Yes	-	-
Firm deposits %	Yes	Yes	-	-
Household loans %	Yes	Yes	-	-
Firm loans %	Yes	Yes	-	-
Bad loans %	Yes	Yes	Yes	Yes
Log-likelihood	-1917.841	-1916.956	-1917.810	-1917.737
Post generalized dep	posit insuran	ce (2006)		
Intercept	Yes	Yes	Yes	Yes
Public banks	-1.957***	-1.857***	-2.244	-2.326***
	(2.57)	(5.08)	(1.60)	(3.88)
Foreign banks	-3.863***	-4.378***	-3.924**	-6.275***
	(2.93)	(10.40)	(2.07)	(3.14)
Household deposits %	Yes	Yes	=	-
Firm deposits %	Yes	Yes	-	-
Household loans %	Yes	Yes	-	-
Firm loans %	Yes	Yes	-	-
Bad loans %	Yes	Yes	Yes	Yes
Log-likelihood	-951.341	-932.902	-998.824	-975.377

Panel D: Public banks defined as banks that receive a high share of interest income from the government bodies / intermediation approach

Pre generalised depe	osit insurance	e (2002)		
Frontier characteristics	(a) environment	(b) equity and environment	(c) environment and activities	(d) equity and environment and activities
Intercept	Yes	Yes	Yes	Yes
Public banks	-0.967	-0.890	-1.320	-1.267
	(1.53)	(1.47)	(1.10)	(1.17)
Foreign banks	0.054	0.067	-0.125	-0.118
	(0.24)	(0.38)	(0.53)	(0.59)
Household deposits %	Yes	Yes	=	=
Firm deposits %	Yes	Yes	-	-
Household loans %	Yes	Yes	-	-
Firm loans %	Yes	Yes	-	-
Bad loans %	Yes	Yes	Yes	Yes
Log-likelihood	-1919.707	-1918.822	-1919.208	-1919.153
Panel B Post genera	lized deposit	insurance (2006)		
Intercept	Yes	Yes	Yes	Yes
Public banks	-2.670**	-2.824***	-2.518	-2.978***
	(2.28)	(3.98)	(1.36)	(2.81)
Foreign banks	-3.892***	-4.359***	-3.847***	-6.380***
	(2.77)	(3.85)	(2.76)	(2.76)
Household deposits %	Yes	Yes	=	-
Firm deposits %	Yes	Yes	-	-
Household loans %	Yes	Yes	-	-
Firm loans %	Yes	Yes	-	-
Bad loans %	Yes	Yes	Yes	Yes
Log-likelihood	-953.868	-934.310	-1000.718	-976.560

Table 7: Size matched results

Panel A: Public banks defined as state-owned banks / poduction approach

	(a)	(b)	(c)	(d)
Frontier characteristics	environment	equity and environment	environment and activities	equity and environment and activities
Intercept	Yes	Yes	Yes	Yes
Public banks	-2.130	-2.153***	-0.226	-0.244
	(1.14)	(2.73)	(0.66)	(0.57)
Foreign banks	0.412	0.384	0.039	0.012
Ü	(0.64)	(1.32)	(0.11)	(0.04)
Household deposits %	1.594	1.035	-	-
1	(0.71)	(1.46)		
Firm deposits %	6.439	6.175***	-	-
•	(1.23)	(3.26)		
Household loans %	2.130	2.681*	-	-
	(1.17)	(1.92)		
Firm loans %	2.226	2.639**	-	-
	(1.36)	(2.23)		
Bad loans %	11.841	15.918**	6.168	6.742
	(1.47)	(2.53)	(1.62)	(1.22)
Log-likelihood	-397.439	-397.026	-390.969	-390.955
Post generalised dep	osit insuran	ce (2006)		
Intercept	Yes	Yes	Yes	Yes
Public banks	-0.331*	-0.190**	-1.406**	-1.280**
	(1.95)	(1.96)	(2.06)	(2.27)
Foreign banks	-1.433***	-0.907***	-2.660*	-1.987**
<u> </u>	(6.74)	(11.58)	(1.94)	(2.36)
Household deposits %	-0.815***	0.030	-	-
•	(3.60)	(0.36)		
Firm deposits %	-0.222	0.154**	-	-
•	(1.16)	(2.48)		
Household loans %	0.718***	0.293	-	-
	(2.69)	(1.64)		
Firm loans %	0.813***	0.416***	-	-
	(3.57)	(3.69)		
Bad loans %	0.018	0.207	-3.215	-4.126
	(0.03)	(1.08)	(0.89)	(1.06)
Log-likelihood	-360.661	-332.218	-349.916	-339.517

Table 8: Robustness to other econometric techniques: DEA

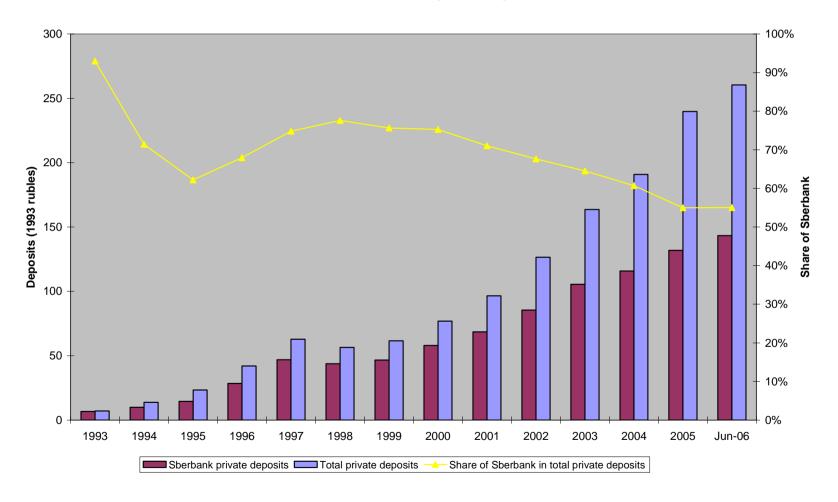
	Before gener	ralised deposit insura	ance (2002)	After generalised deposit insurance (2006)			
Frontier characteristics	(a)	(b)	(c)	(d)	(e)	(1)	
Intercept	Yes	Yes	Yes	Yes	Yes	Yes	
D. 1.1 1 1	-0.007	-0.0233	-0.021	0.014	0.013	0.013	
Public banks	(0.32)	(1.16)	(1.07)	(0.68)	(0.63)	(0.61)	
E 1 1	0.055***	0.008	0.008	0.145***	0.135***	0.135***	
Foreign banks	(3.03)	(0.44)	(0.45)	(8.00)	(6.66)	(6.67)	
Activities	-	Yes	Yes	-	Yes	Yes	
Bad loans	-	-	Yes	-	-	Yes	
Log-likelihood	733.983	776.945	785.229	525.603	538.238	538.296	
Panel B: Public	banks defined a	s state-owned ba	nks, size-matche	d sample			
Intercept	Yes	Yes	Yes	Yes	Yes	Yes	
D 11' 1 1	-0.023	-0.034	-0.033	0.024	0.018	0.017	
Public banks	(0.68)	(1.01)	(1.00)	(0.78)	(0.63)	(0.60)	
E ' 1 1	0.055*	0.005	0.004	0.152***	0.128***	0.112***	
Foreign banks	(1.90)	(0.18)	(0.12)	(6.11)	(4.31)	(3.70)	
Activities	-	Yes	Yes	-	Yes	Yes	
Bad loans	-	-	Yes	-	-	Yes	
Log-likelihood	85.342	93.296	94.764	130.483	147.455	149.411	

Environment' means that regional dummies are included in the estimation of the cost frontier. 'Equity' refers to the inclusion of the bank's equity in the estimation of the cost frontier. N=747 for the first period, N=471 for the second period. Absolute t-statistics are displayed in parentheses, \*, \*\*, \*\*\* denote an estimate significantly different from zero at the 10%, 5% or 1% level

Figure 1: Sberbank's dominance in the personal deposit market

Source: own calculations based on CBR Bulletin of Bank Statistics and Sberbank

# Sberbank share of total private deposits



# ANNEX Table A.1: Means of key variables between private and public banks for the size-matched sample

	20	02	20	06
	Private banks	Public banks	Private banks	Public banks
Characteristics				
Total assets	5,151.91	7,401.68	8,121.43	32,322.32
Total costs (production)	203.89	281.03	388.71	1,108.36
Total costs (intermediation)	240.25	339.56	459.19	1,352.25
Loans	3,911.10	4,898.84	6,058.27	23,751.46
Deposits	3,763.33	5,315.51	6,332.80	25,765.57
Investment assets	325.33	915.25	1,143.52	5,345.11
Price of labor	0.0083	0.0112	0.0087	0.0087
Price of physical capital	2.4495	1.2885	2.1035	1.5660
Price of borrowed funds	0.0105	0.0086	0.0125	0.0111
Equity/total assets	0.2149	0.2313	0.1448	0.1341
Bad loans / loans	0.0207	0.0229	0.0203	0.0107
Loan activities				
Household loans / loans	0.0495	0.0248	0.1632	0.1591
Firm loans / loans	0.6163	0.6586	0.6431	0.6606
Government loans / loans	0.0099	0.0111	0.0074	0.0189
Bank loans / loans	0.3243	0.3055	0.1862	0.1614
Deposit activities				
Household dep./ deposits	0.1977	0.1204	0.3755	0.3561
Firm deposits / deposits	0.5180	0.5858	0.4606	0.3872
Government dep.	0.0359	0.1438	0.0186	0.1452
/deposits				
Bank dep. / deposits	0.2484	0.1501	0.1454	0.1115
Environment				
Moscow area	0.6016	0.5882	0.5106	0.4167
Number of observations	492	68	564	48

Table A.2 Further size matched results

Panel B: Public banks defined as banks that receive a high share of interest income from the government bodies / poduction approach

Pre generalized deposit insurance (2002)						
	(a)	(b)	(c)	(d)		
Frontier characteristics	environment	equity	environment	equity		
Tionner characteristics		and environment	and activities	and environment		
				and activities		
Intercept	Yes	Yes	Yes	Yes		
Public banks	-2.934	-3.236**	-0.993	-0.994		
	(1.40)	(2.03)	(0.43)	(0.45)		
Foreign banks	0.655	1.050	0.065	0.045		
	(1.01)	(1.62)	(0.26)	(0.12)		
Household deposits %	2.451	3.363**	-	-		
	(1.28)	(1.97)				
Firm deposits %	7.025*	7.719***	-	-		
	(1.80)	(2.62)				
Household loans %	2.563	3.115**	-	-		
	(1.47)	(2.19)				
Firm loans %	2.356*	2.064	-	-		
	(1.83)	(2.43)				
Bad loans %	13.430***	7.458	6.477	6.806		
	(2.14)	(4.39)	(1.50)	(1.15)		
Log-likelihood	-399.040	-397.810	-390.961	-390.958		
Post generalized dep	posit insuran	ce (2006)				
Intercept	Yes	Yes	Yes	Yes		
Public banks	-0.386	-0.232	-3.680*	-2.779*		
	(0.93)	(0.93)	(1.91)	(1.70)		
Foreign banks	-1.221***	-0.940***	-1.943**	-1.490**		
	(6.42)	(18.57)	(2.41)	(2.27)		
Household deposits %	-0.586**	-0.036	-	-		
•	(2.23)	(0.95)				
Firm deposits %	-0.049	0.107***	-	_		
1	(0.27)	(2.72)				
Household loans %	0.718***	0.665***	-	-		
	(2.81)	(4.11)				
Firm loans %	0.808***	0.329***	-	-		
	(3.72)	(5.13)				
Bad loans %	-0.251	0.881***	-4.794	-5.458		
	(0.24)	(4.89)	(0.93)	(0.77)		
Log-likelihood	-365.493	-320.609	-350.452	-340.378		

Panel C: Public banks defined as state-owned banks /intermediation approach

Pre generalised deposit insurance (2002)						
	(a)	(b)	(c)	(d)		
Frontier characteristics	environment	equity	environment	equity		
1 Tomici characteristics		and environment	and activities	and environment and activities		
Intercept	Yes	Yes	Yes	Yes		
Public banks	-2.431	-3.593	-5.097	-5.466**		
r ublic ballks	(1.36)	(1.19)	(0.60)	(2.06)		
Foreign banks	-0.008	0.158	0.503	1.609*		
roreign banks	(0.02)	(0.51)	(0.33)	(1.65)		
Household deposits %	-0.407	0.126	(0.55)	(1.03)		
110usciloid deposits 70	(0.36)	(0.07)	-	-		
Firm deposits %	0.36)	6.680				
Tilli deposits 70	(1.76)		-	-		
Household loans %	-1.657	(1.48) -2.028				
Household loans 70	(0.74)	(1.58)	-	<del>-</del>		
Firm loans %	0.527	0.241				
FIIIII IOalis /0	(0.93)	(0.32)	-	-		
Bad loans %	9.552**	(0.32) 7.142	17.085	-0.539		
Dad IOans 70	(2.10)	(1.56)	(0.79)	(0.14)		
Log-likelihood	-327.203	-326.982	-333.275	-331.822		
Post generalised dep			-333.473	-331.022		
Intercept	Yes	Yes	Yes	Yes		
Public banks	-1.304	-1.393*	-1.478	-1.619		
rubiic baliks				(1.20)		
Equation hands	(1.62) -2.031**	(1.87) -2.080*	(0.68) -2.760	-2.668		
Foreign banks						
Househald demonstra 0/	(2.03) -4.213**	(1.85) -4.195**	(0.82)	(1.25)		
Household deposits %			-	-		
Eine domonita 0/	(2.34) 0.181	(2.11) 0.255				
Firm deposits %			-	-		
Household loans %	(0.35) 1.548**	(0.69)				
Household loans %		1.606*	-	-		
Firm loans %	(1.99) 1.538*	(1.94) 1.450**				
THIII IOAHS /0			-	-		
Bad loans %	(1.91) 0.404	(2.19)	-4.044	1 117		
Dau IOalis /0	(0.15)	0.242 (0.15)	(0.63)	-4.117 (0.90)		
Too libelihood	. ,	\ /		\ /		
Log-likelihood	-220.328	-218.397	-205.273	-200.991		

Panel D: Public banks defined as banks that receive a high share of interest income from the government bodies / intermediation approach

Pre generalised deposit insurance (2002)						
	(a)	(b)	(c)	(d)		
Frontier characteristics	environment	equity	environment	equity		
1 Tomaci characteristics		and environment	and activities	and environment		
				and activities		
Intercept	Yes	Yes	Yes	Yes		
Public banks	-3.323	-4.430	-13.875	-13.125***		
	(1.34)	(0.66)	(1.21)	(2.57)		
Foreign banks	0.127	0.353	0.685	1.840*		
	(0.42)	(0.35)	(1.06)	(1.93)		
Household deposits %	0.276	0.846	-	-		
	(0.23)	(0.29)				
Firm deposits %	4.403*	6.259	-	-		
	(1.72)	(0.67)				
Household loans %	-1.394	-1.884	-	-		
	(0.85)	(0.55)				
Firm loans %	0.422	0.212	-	-		
	(1.09)	(0.30)				
Bad loans %	9.870**	8.760	15.098	1.318		
	(2.02)	(1.09)	(1.54)	(0.53)		
Log-likelihood	-331.408	-331.208	-334.246	-332.787		
Post generalized dep	posit insurane	ce (2006)				
Intercept	Yes	Yes	Yes	Yes		
Public banks	-1.464	-1.382	-2.555	-1.690		
	(0.93)	(0.98)	(0.54)	(1.28)		
Foreign banks	-1.775*	-1.832*	-2.449	-2.392		
	(1.91)	(1.68)	(0.80)	(1.52)		
Household deposits %	-3.826**	-3.849**	-	-		
	(2.39)	(2.26)				
Firm deposits %	0.674	0.791	-	-		
	(1.50)	(1.37)				
Household loans %	1.539*	1.622*	-	-		
	(1.90)	(1.94)				
Firm loans %	1.686**	1.634**	-	-		
	(2.41)	(2.06)				
Bad loans %	0.191	0.033	-4.504	-4.400		
	(0.09)	(0.01)	(0.48)	(1.21)		
Log-likelihood	-223.653	-222.113	-205.615	-201.543		