## Temi di Discussione

(Working Papers)
Do interbank customer relationships exist? And how did they function in the crisis? Learning from Italy
by Massimiliano Affinito

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# DO INTERBANK CUSTOMER RELATIONSHIPS EXIST? AND HOW DID THEY FUNCTION IN THE CRISIS? LEARNING FROM ITALY 

by Massimiliano Affinito*


#### Abstract

Using 11 years of monthly Italian bank-by-bank data, this paper correlates the bilateral amounts and the identity of each interbank borrower and lender with a long list of explanatory variables. The results show that interbank customer relationships, i.e. stable and strong relationships between pairs of borrowing and lending banks, do exist in Italy, that they persist over time, and that they functioned well during the crisis, enabling the healthier banks to provide and the troubled ones to receive funds.


JEL Classification: G21, G28, C23, C24.
Keywords: interbank market, lending relationship, financial crisis.

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## 1. Introduction ${ }^{1}$

The interbank market is crucial for the correct functioning of all financial system, for implementing monetary policy, and for successive borrowing conditions of households and firms. Its malfunctioning in several systems during the crisis is accordingly a cause of concern (Allen and Carletti, 2008; Brunnermeier, 2009; Heider, Hoerova and Holthausen, 2009). This paper joins the debate with empirical inquiry into: (a) the characteristics that banks consider in assessing other banks' creditworthiness; and (b) any modifications of characteristics during the turmoil.

The focus is on the existence and the functioning of "interbank customer relationships". The literature uses the terms "lending relationship," "relationship banking" or "customer relationship" to describe the stable (over time) and strong (quantitatively relevant) relationship that typically arises between banks (lenders) and non-financial firms (borrowers). When, as in this study, both lenders and borrowers are banks, then customer relationships are "interbank". The literature on bank-firm relationships underscores that customer relationships benefit both parties: the lender gets borrowerspecific, often proprietary information in order to perform screening and monitoring functions and overcome problems of information asymmetry; the borrower may obtain lower funding cost and greater availability of credit. ${ }^{2}$ In particular, since the durable relationship allows for better prediction of when borrowers will bounce back and accommodates inter-temporal smoothing of lenders' income, this literature predicts that lenders will ensure the availability of credit to their long-time customers when they are in difficulty (e.g. Chemmanur and Fulghieri, 1994; Petersen and Rajan, 1994; Kashyap et al., 2002), or precisely in times of financial turmoil (De Mitri et al., 2010). This paper analyses exactly whether, just as in bank-firm relationships, the frequent and repeated interactions of the interbank market originate special steady relationships among pairs of banks, and whether these "interbank customer relationships" benefit the borrowing banks, in particular those in difficulty during the crisis.

[^1]The hypothesis of "interbank customer relationships" is not new, but the novelty of this paper is the fact that, for the first time to my knowledge, I explicitly and empirically test their existence and persistence, and verify their impact during a crisis. For example, Ferri and Marullo Reedtz (1989), analyzing the Italian interbank market in the Eighties, already use the expression interbank customer relationships, but verify neither their existence nor their effects. Furfine (2001) analyses the effects of interbank customer relationships (measured by different indexes) on the U.S. interbank interest rates, but he assumes but does not demonstrate their existence. Cocco et al. (2009) step forward. Not only they estimate the effect of interbank customer relationships on the interbank interest rates, but even include in their analysis some determinants of interbank customer relationships. However, they use a considerably smaller number of explanatory variables, and do not explicitly test whether interbank customer relationships exist and persist; neither, of course, they analyze the effects of a financial crisis on interbank customer relationships because their sample covers the Portuguese interbank market between 1997 and 2001. Afonso et al. (2010) underscore that "it is important to investigate the role that banking relationships and repeat interactions in the fed funds market can play in improved monitoring of counterparty risks or as a vehicle to provide coinsurance of liquidity needs", but leave this issue as agenda for future research.

In this respect, Italy is an interesting case to study for three main reasons. First, it is a bankbased economy so that, if interbank customer relationships exist, they are likely to matter. Second, since "the Italian banking system has weathered the crisis better than many others" (Draghi, 2009), it is particularly interesting to analyze possible reasons of this resilience. Third, data supervisory reporting requirements in Italy allow one to know the bilateral amounts and identities of every interbank borrower and lender.

My empirical analysis uses nearly 450,000 monthly observations from June 1998 to April 2009. It is a three-step process. I first verify the existence of stable interbank customer relationships by the criteria of length and continuity, running a duration model as in Ongena and Smith (2001); then examine the determinants of strong interbank customer relationships, i.e. the characteristics of the banks that rely more on interbank relationships both as borrowers and as lenders; and lastly study the functioning of interbank customer relationships during the 2007-2009 phase of the crisis. The findings have significant economic and policy implications: interbank customer relationships exist and persist over time; and they enable banks not to lose mutual trust, so that the healthier banks can provide much-need funds to those more severely affected by the crisis.

My paper is related to various fields of research. One is the literature on bank-firm relationships. Despite the evident differences between firm-bank and bank-bank partnerships, I apply some concepts and methodologies developed for the former to the interbank market.

Second, my paper is related to the literature on market discipline in banking, according to which if banks carry out peer monitoring, regulators can use banks' signals to identify risky intermediaries. It is to highlight that, although these concepts were already present in Goodfriend and King (1988), Kaufman (1991), Berger (1991) and Schwartz (1992), who pointed out that banks are the best-informed parties to judge the solvency of illiquid banks, the views set forth in this literature are still contrasting. On the one hand, some authors - Bhattacharya and Gale (1987), Flannery (1996), Allen and Gale (2000), Freixas et al. (2000), Freixas and Jorge (2007) Allen et al. (2008) signal that banks should not be able to monitor their peers because interbank markets, like other credit markets, are characterized by moral hazard and asymmetric information. Likewise, Goodfriend (2002) and Martin and McAndrews (2007) claim that banks are not apt to monitor other banks, because the implicit guarantee supplied by central banks, which are expected to intervene in case of crisis, undermines banks' incentives to monitor their peers. On the other hand, Rochet and Tirole (1996) demonstrate that interbank exposures might generate incentives for lending banks to monitor borrowing banks, even if this disciplinary role is relatively ineffective because interbank exposures can be quickly abandoned owing to their typically short-term maturity. Much more, Calomiris (1998) stresses that banks may serve as monitors of other banks because kindred institutions are best able to identify a peer's risk. DeYoung et al. (1998), Peek et al. (1999), Berger et al. (2000), and Furfine (2002) also admit that banks possess knowledge regarding other bank's health, even while highlighting that this is only complementary to the knowledge of central banks. In empirical analysis, admittedly still scarce, the hypothesis of peer monitoring prevails. Furfine (2001) documents that interbank interest rates in the U.S. federal funds market reflect in part the credit risk of the borrowing banks. Ashcraft and Bleakley (2006) find evidence, though weak, of the existence of market discipline. King (2008) demonstrates that high-risk banks pay more than safe banks for interbank loans. Dinger and von Hagen (2009) show that in systems characterized by longer-term interbank exposures the monitoring role of lenders is more important. My paper contributes to this literature by showing that banks maintain long-term relationships and base these relationships on mutual monitoring. And the results suggest that stable interbank customer relationships, and the related peer monitoring, are helpful to macro-regulators in avoiding failures in liquidity reallocation.

Third, the paper relates to the growing literature on the impact of the crisis on the functioning of financial markets, and specifically on the interbank market. ${ }^{3}$ In particular, my analysis complements those of Cassola et al. (2008); Angelini et al. (2011); and Afonso et al. (2010). Cassola et al. (2008) note that the crisis exacerbated cross-country asymmetric information problems and caused a decline in cross-border transactions; consistently, I show that, unlike cross-country transactions, the Italian domestic interbank market did not experience such a deterioration. Angelini et al. (2011) also analyse the Italian interbank market before and after crisis. Although their focus is different, as they study the determinants of the interbank interest rate spread, my findings are consistent with their main conclusion. They find that the widening interbank spread was not due to bank-specific factors but to increasing aggregate risk aversion; accordingly, my paper shows that, during the crisis, interbank customer relationships seemed to work well and bank-specific characteristics, even when deteriorated, did not hamper interbank transactions. Afonso et al. (2010) examine the impact of the financial crisis on the U.S. interbank market. They find that, in the days immediately after Lehman Brothers' bankruptcy, borrowing bank-specific characteristics become more important in driving the lending banks' decisions, entailing an increased differentiation on the federal funds market between borrowing banks of high versus low type, not only on the amounts lent but even in the cost of funds. They also show that the return to the pre-crisis levels occurs as the effect of the government support for systematically important banks. By contrast, my analysis shows that Italian inter-group domestic interbank exposures did not decrease after the onset of the crisis, one reason being the presence of interbank customer relationships. This contributes also to explain why government intervention in Italy has been negligible in comparison to other countries (Panetta et al., 2009). Moreover, Afonso et al. do not find in the U.S. market a relationship between lending banks' characteristics and amounts lent, while I show that after the crisis in Italy just the healthier banks are willing to be substantial lenders in the interbank customer relationships.

The rest of the paper is organized as follows. Section 2 describes the three steps of my analysis. Section 3 presents my data on dependent variables and on covariates. Section 4 reports the results, Section 5 summarizes robustness checks, and Section 6 concludes.

[^2]
## 2. Empirical strategy

My empirical analysis is divided into three steps. The first examines stability over time and the second the quantitative strength of interbank customer relationships, although the two concepts of stability and strength are constantly intermingled in both stages of analysis. The third step is the inquiry into what happened during the recent financial crisis.

As mentioned in the Introduction, in my first step, I estimate a duration model following Ongena and Smith (2001). Duration models are typically used in labour economics to estimate, say, duration of unemployment; they are used by Ongena and Smith (2001) to estimate the duration of firm-bank relationships; and by me to estimate the duration of bank-bank relationships.

These models analyse the span of time that passes from a beginning condition (initial state) to the occurrence of a certain random event (switch). In my case, the initial state starts when a bank for the first time lends to - or borrows from - another bank (that is, when an interbank relationship between a pair of banks is established); and the switch occurs when the interbank exposure dries up (that is, when the interbank relationship ends or breaks even only for one period). ${ }^{4}$

In particular, these models allow one to estimate the presence of positive or negative duration dependence. Duration dependence is said to be positive when the probability that a switch from the initial state occurs increases as the time span lengthens; negative when that probability decreases and the initial state accordingly proves to be stable. Ongena and Smith (2001) find positive duration dependence in relationships between firms and banks in Norway - firms are more likely to leave a bank as the span increases - and therefore conclude that the value of the firm-bank relationship declines over time. I utilize the same methodology and the same argument but find negative duration dependence, i.e. that the probability of ending or breaking an interbank relationship decreases over time. I accordingly conclude that stable interbank relationships exist.

The presence of positive or negative duration dependence is estimated through a hazard function $\lambda(t)$. The hazard function provides a suitable method for summarising the relation between span length and the likelihood of switching because it determines the probability that a switch will occur, conditional on the span surviving through time $t$. When $\lambda(t)$ is increasing (decreasing) in $t$, the hazard function exhibits positive (negative) duration dependence; when $\lambda(t)$ is constant in $t$, there is constant duration dependence and thus no correlation between span and switch.

[^3]In formal terms, I use the following proportional hazard specification to estimate $\lambda(t)$ :

$$
\begin{align*}
\lambda\left(t, K_{i, t}^{L}, K_{j, t}^{B}, K_{i, j, t}^{L B}\right) & =\lim _{\Delta t_{s} \rightarrow 0} \frac{P\left(t_{s} \leq T_{s}<T_{s}+\Delta t_{s} \mid T_{s} \geq t_{s}, K_{i, t}^{L}, K_{j, t}^{B}, K_{i, j, t}^{L B}, \alpha, \beta, \gamma\right)}{\Delta t_{s}}= \\
& =\lambda_{0}(t) \exp \left(\alpha_{k}^{\prime}{ }_{k}^{l} \mathrm{~K}_{i, t}^{\mathrm{L}}+{\left.\beta_{k}^{\prime}{ }_{k}^{b} \mathrm{~K}_{j, t}^{\mathrm{B}}+\gamma_{k}^{\prime}{ }_{k}^{l b} \mathrm{~K}^{\mathrm{LB}}{ }_{i, j}\right)}^{\text {th }}\right. \text { ) } \tag{1.1}
\end{align*}
$$

where $t_{s}$ is the time when a switch from the initial state of interbank relationship occurs; $T_{s}$ is the span that passes before the switch occurs; $\lambda_{0}(t)$ is the baseline hazard function that describes the probability of leaving the initial state of relationship for hypothetical banks with no set of characteristics, which serve as a reference group. The duration model also allows one to infer the determinants of duration, which in my case are captured by the adjustment factor $\exp \left(\alpha_{k}^{\prime}{ }_{k} \mathrm{~K}^{\mathrm{L}}{ }_{i, t}+\beta_{k}^{\prime}{ }_{k} \mathrm{~K}^{\mathrm{B}}{ }_{j, t}+\gamma^{\prime}{ }_{k}^{l b} \mathrm{~K}^{\mathrm{LB}}{ }_{i, j, t}\right.$ ), where $K^{L}{ }_{\mathrm{i}, t}$ is a matrix ( $n t \mathrm{x} k^{l}$ ) of lending banks' characteristics; $K^{B} \mathrm{i}, \mathrm{t}$ is a matrix ( $r t \mathrm{x} k^{b}$ ) of borrowing banks' characteristics; and $\mathrm{K}^{\mathrm{LB}}{ }_{i, j, t}$ is a matrix ( $n r t \mathrm{x} k^{l b}$ ) of the characteristics capturing interactions between lending and borrowing banks. The logarithm of $\lambda$ is linear in $\alpha_{k}^{\prime}{ }_{k} \mathrm{~K}_{i, t}+\beta_{k}^{\prime}{ }_{k} \mathrm{~K}^{\mathrm{B}}{ }_{j, t}+\gamma_{k}^{\prime}{ }_{k}^{l b} \mathrm{~K}^{\mathrm{LB}}{ }_{i, j, t}$, where $\alpha, \beta$, and $\gamma$ are vectors of coefficients. Each coefficient therefore measures the proportional change in the hazard rate that can be attributed to an absolute change in the regressors. Finally, $k^{l}, k^{b}$, and $k^{l b}$ indicate the different number of regressors in each matrix.

Computationally, it is standard to adopt the Weibull model as a functional form of the baseline hazard $\lambda_{0}(t) .{ }^{5}$ It states that:
$\lambda_{0}(t)=\theta \varphi t^{\varphi-1}$
where $\theta>0$ and $\varphi>0$ are unknown parameters. On the basis of estimations: when $\varphi=1$, the distribution exhibits constant duration dependence; when $\varphi>1$, positive duration dependence; and when $\varphi<1$, negative duration dependence.

Once the existence of stable relationships has been investigated, the second step analyses the determinants of strong relationships. To this end, preliminarily, I measure the strength of each lending and borrowing relationship through two indexes. The first is computed as the ratio between the total funds that $i$ lends to $j\left(L^{i \rightarrow j}\right)$ and the total funds that $i$ lends in the interbank market

[^4]( $\sum L^{i \rightarrow N_{t}}$ ), which gauges whether $j$ is a substantial interbank borrower of $i$ (substantial borrower index, hereafter SBI):
$\operatorname{SBI}_{i, j, t}=\left[\frac{L^{i \rightarrow j}}{\sum L^{i \rightarrow N_{t}}}\right]_{t}$,
where $i, j=1,2, \ldots, N_{t}$ indicate all pairs of banks $i \neq j$; and $t=1,2, \ldots, T$ are the time periods. The subscript $t$ in $N_{t}$ indicates that the number of banks operating in the interbank market and the number of counterparties change over time and across banks.

The second index is computed as the ratio between the total funds that $i$ borrows from $j$ ( $B^{i \leftarrow j}$ ) and the total funds that $i$ borrows in the interbank market ( $\sum B^{i \leftarrow N_{t}}$ ), and gauges whether $j$ is a substantial interbank lender of $i$ (substantial lender index, hereafter SLI):
$\operatorname{SLI}_{i, j, t}=\left[\frac{B^{i \leftarrow j}}{\sum B^{i \leftarrow N_{t}}}\right]_{t}$.

The higher the two indexes, the closer the interbank customer relationship. As a check, I also construct alternative measures of the two indexes based on the number of interbank relationships rather than on transacted quantities. ${ }^{6}$

Next I analyse the determinants of these indexes; that is, I try to detect the banking characteristics that strengthen interbank relationships. Again, as in equation (1.1), I investigate the determinants of my indexes using as regressors both lender-side and borrower-side characteristics along with variables measuring the interactions between lenders and borrowers. In formal terms, I estimate the following equation:
$\mathrm{I}_{i, j, t}=\alpha_{k}^{\prime}{ }_{k} \mathrm{~K}^{\mathrm{L}}{ }_{i, t}+\beta_{k}^{\prime}{ }_{k} \mathrm{~K}^{\mathrm{B}}{ }_{j, t}+\gamma_{k}^{\prime}{ }_{k}^{b} \mathrm{~K}^{\mathrm{LB}}{ }_{i, j, t}+\eta_{\mathrm{i}, \mathrm{t}}$

[^5]where $\mathrm{I}_{i, j, t}$ is equal alternatively to either $\mathrm{SBI}_{i, j, t}$ or $\operatorname{SLI}_{i, j, t}$, defined in equations (2.1) and (2.2); $\alpha_{k}^{\prime}{ }_{k}^{l}$, $\mathrm{K}^{\mathrm{L}}{ }_{i, t}, \beta_{k}^{\prime}{ }_{k}^{b}, \mathrm{~K}_{j, t}^{\mathrm{B}}, \gamma_{k}^{\prime l b}, \mathrm{~K}^{\mathrm{LB}}{ }_{i, j, t}$ are defined as in equation (1.1), and $\eta_{\mathrm{i}, \mathrm{t}}$ is the idiosyncratic error $\sim$ i.i.d. $\left(0, \sigma_{\eta}{ }^{2}\right)$. Since my indexes capture the cross-sectional and the longitudinal dimension of interbank customer relationships, the second step uses the panel estimation as a basic regression model.

The third step investigates both the effects of the crisis on interbank customer relationships and the way in which interbank customer relationships affect the consequences of the crisis, repeating the exercises of the two previous steps after splitting the entire sample period into two time spans, before and after the crisis.

## 3. Data

### 3.1 Key variables: duration and strength of interbank relationships

In the first step, the key variable is the duration of each interbank relationship. In the second step, the dependent variables are the indexes SBI and SLI, computed first on the quantities of interbank exposures in the basic estimations, and then, as a check, on the number of counterparties. In the third step, all the key variables are used. Table 1 reports their summary statistics. Table 2 shows the relations among them, when computed as averages, first by each bank, and then across banks and over time.

All the key variables are computed on monthly Italian bank-by-bank data, drawn from the Bank of Italy's prudential supervisory reports. The Bank of Italy collects information on gross bilateral interbank exposures (assets and liabilities of each bank), and the identity of every counterparty. My sample covers monthly data from June 1998 to April 2009, so the number of time periods is: $t_{i}=1,2, \ldots, T_{i}$, where $T_{i}=131$ if the bank is always present in the interbank market. Since in Italy all banks, including branches of foreign banks, must report to the Bank of Italy, my data refer to all banks operating in Italy. The number of banks $i=1,2, \ldots, N_{t}$ varies in each $t$ from 833 in June 1998 to 771 in April 2009. The number of counterparties $c_{i, t}=1,2, \ldots, \mathrm{C}_{i, t}$ varies across banks and over time. The final number of observations is $T_{i} N_{t} \mathrm{C}_{i, t}=460,964$.

Three aspects deserve emphasis. First, I focus on quantity measures of interbank customer relationships. This choice is not unusual. Emphasis on the quantity dimension has been growing in the literature on interbank markets (e.g. Furfine, 2004 and 2009; King, 2008; Dinger and von Hagen, 2009; Cocco et al., 2009) and is common in the related literature on firm-bank relationships.

Moreover, it allows me to analyse all Italian interbank exposures, including over-the-counter ones for which interest rate data are not available.

Second, although interbank activity is usually at very short maturities, I use end-of-month stocks for my dependent variables, because data on quantities are not available on a more frequent basis. For example, Cocco et al. (2009) and Angelini et al. (2011) utilize daily data for interest rates, but quarterly or yearly data for their regressors; King (2008) uses only quarterly data; and Dinger and von Hagen (2009) only yearly data.

Third, my key variables are computed on the component of interbank transactions carried out domestically by banks belonging to different banking groups (inter-group exposures). In other words, I dropped the data on non-domestic and intra-group transactions. The non-domestic exposures are removed simply because, although the Bank of Italy's database allows one to obtain the stock of interbank exposures from and to abroad, I could not determine the characteristics of foreign counterparties as regressors. The intra-group (or internal capital market) exposures are removed because these transactions fit into a group-specific scheme, are likely to be decided by the parent bank, and are affected by group task-sharing (e.g. Houston et al., 1997; de Haas and van Lelyveld, 2010). In any case, although intra-group and cross-country transactions were eliminated from the key variables, I retained them as two explanatory variables.

In order to eliminate the intra-group exposures, I used information on the identity of each counterparty and its group. For the banks that changed group during my sample period I traced the current group of affiliation in each $t_{i}$, and analyzed their effective inter-group relationships in each period. To exemplify how I computed the span $T_{s}$ in these cases, let us assume three banks initially belonging to two banking groups: $a$ to group $A ; b$ and $c$ to $B$. Let us assume also that the three banks maintain always mutual interbank exposures, and at $t_{s} c$ is acquired by group $A$. Before $t_{s}$, I exclude the transactions between $b$ and $c$ as intra-group. After $t_{s}$, my counting: (i) continues unchanged for the relationships between $a$ and $b$ because the two banks were and remain in different groups; (ii) ends for $a$ and $c$ because their mutual exposures become intra-group; (iii) starts for the first time for the transactions between $b$ and $c$ because their relationship becomes inter-group.

My approach works well even when an interbank relationship ends because one of the two involved banks leaves the market as a consequence of a merger. In fact, in such circumstances in the abstract there may be a (disputable) measurement error, but in practice in my sample it is unimportant. To clarify this point, let assume again three banks: $x$ and $y$ have an interbank relationship before $t_{s}$, and $x$ leaves at $t_{s}$ because it merges with $z$. At $t_{s}$, my counting of duration of the
relationship between $x$ and $y$ obviously ceases. Also at $t_{s}$, for $y$ and $z$ there are four hypothetical cases: $y$ and $z$ (i) continue to have no relationship; (ii) continue a previous relationship; (iii) cease their relationship; (iv) establish a relationship. In the first three cases, my counting of duration does not present problems. Only in the last case, the relationship between $y$ and $z$ might possibly derive from the past relationship between $x$ and $y$, whereas I begin a new count. However, in practice such situations are negligible in my sample. ${ }^{7}$

Figures 1 and 2 plot outstanding amounts and percentage shares of total assets of four kinds of interbank exposures: total, non-domestic, intra-group and inter-group. The figures show that, apart from non-domestic exposures (Cassola et al., 2008; Heider et al., 2009), the amounts of Italian interbank domestic exposures have not fallen since the onset of the crisis. The figures also show that inter-group activity accounts for a relatively small share of total transactions among banks, while an increasing majority is accounted for by the internal capital market. Therefore, my approach serves to remove a large quantity of misleading and noisy information.

An examination of my descriptive statistics serves mainly to confirm the need for more sophisticated statistical tools. The average duration of an interbank relationship is 28 consecutive months, when the average is computed on the ongoing duration in each period; it lengthens to 47 consecutive months, when the average is computed on the final duration of all relationships; and to 96, when the average is computed on the final duration of the longest relationships of each bank (Table 1). The average number of borrowers is 5 and the average number of lenders 8 . The greater concentration of the borrowing side is confirmed by the average value of SBI, equal to 0.19 , which is higher than the average value of SLI, 0.13. In general, longer relationships are associated with stronger relationships and fewer counterparties (Table 2). However, there is no lack of non-linear effects. The hypothesis of the existence and strengthening over time of interbank customer relationships seems to be supported by the fact that the average values of SLI and SBI are increasing (Figure 3), and the number of counterparties is decreasing (Figure 4). On the other hand, these average developments may simply derive from the general process of banking concentration. Figure 5 plots different specifications of the final duration of interbank relationships, both in terms of the

[^6]number of months and as a percentage of the effective presence in the interbank market. If one refers to the longest interbank relationship of each bank, about 70 per cent of banks and 80 per cent of the interbank market maintain at least one very long-lasting relationship (at least 81 consecutive months or more than 80 per cent of the periods of interbank activity). On the other hand, if one refers to the average duration of all relationships, the distribution is much more uniform.

### 3.2. Explanatory variables and expected signs

Table 3 lists my explanatory variables, tells how they are calculated, and gives their summary statistics. All regressors are dummy variables, ratios or natural logarithms. ${ }^{8}$ My regressors belong to the matrixes $\mathrm{K}_{j, t}^{\mathrm{B}}, \mathrm{K}^{\mathrm{L}}$, , , and $\mathrm{K}^{\mathrm{LB}}{ }_{i, j, t}$ of equations (1.1) and (2.3) depending on whether they refer to borrowers, lenders or both. The covariates may be classified in six groups on the basis of the effect they proxy (Table 4).

The first variable, Relationship Duration, is similar to the key variable in the first step of the analysis ( $T_{s}$ in equation 1.1), and thus is used as a regressor only in the second and third steps. ${ }^{9}$ In fact, in addition to being the object of the analysis in the first step, the duration of a relationship may affect its strength. In particular, its expected sign is positive if interbank customer relationships persist over time and their length positively affects their strength (as this relates to bank-firm relationship, see Petersan and Rajan, 1994; Berger and Udell, 1995). ${ }^{10}$

The second group of regressors includes seven borrower-specific variables, which are related to agency problems (Table 4, second column, upper panel): Size, Capital, Bad Loans, Structure of Income/Opacity, ROE, Rating, and Banks without Rating. The expected sign of these variables is exante ambiguous. On the one hand, if a regressor signals higher asymmetric information, the expected effect on my dependent variables is negative. On the other hand, as is argued in the literature on

[^7]relationships between banks and non-financial corporations, customer relationships can overcome agency problems, so borrowers may be financed mainly when troubled in the short term and the effect of testable indicators may turn out to be inverted (e.g. Chemmanur and Fulghieri, 1994; Petersen and Rajan, 1994, 1995; Berlin and Mester, 1999; Kashyap et al., 2002). ${ }^{11}$

Two regressors in this group measure the role of rating agencies. "Rating" is coded so as to take values from 1 to 11 , where 1 corresponds to the best rating class and 10 to the worst, with 11 assigned to banks with no rating. At the same time, following Angelini et al. (2011), I use a dummy variable, "Banks without Rating," that takes the value of 1 for banks with no rating and 0 otherwise. In the estimations, I use four different kinds of credit scores taken from the agency Fitch through the database of Bloomberg. ${ }^{12}$ Being an inverse measure, the expected sign of borrowers' Rating is negative if lending banks trust credit rating agencies and use them to value the creditworthiness of borrowing banks; it is positive (or possibly insignificant) if lending banks distrust rating agencies or if interbank customer relationships render their judgement pointless. The prediction of the dummy Banks without Rating is equally uncertain (see Morgan, 2002; Flannery, Kwan, and Nimalendran, 2004).

The seven regressors of the third group of variables are equivalent to the previous ones, but are referred to lenders instead of borrowers. In this case, they do not measure agency problems, but the lending capacity of banks. Their predictions are equally open. For example, lenders' Capital and ROE are positive if only well-capitalized and profitable banks are lenders in the interbank market but negative if well-capitalized and profitable banks are more active outside than inside the interbank market.

The fourth group of regressors concerns three variables related to borrowers' and lenders' liquidity situation. Fund Raising measures the level of liquidity of each bank; Volatility of Liquidity measures the related degree of volatility; and, following Cocco et al. (2009), Liquidity Shocks

[^8]Correlation measures the correlation between the liquidity shocks of each pair of banks. The predictions are again open. For example, the higher Fund Raising is, the less likely a bank should be to request funds from other banks, and the more likely it should be to offer funds. However, the sign might be opposite if, for example, highly liquid banks choose more remunerative investments than interbank lending.

The fifth group of variables includes five covariates that proxy the use banks make of their liquidity. Three regressors refer to both borrowers and lenders: Total Loans, Non-Domestic Assets, and Total Shares. Two are calculated only for borrowers: Intra-group Interbank Net Position measures the net position of each bank inside its banking group (the internal capital market); NonDomestic Interbank Net Position measures the external net position of each bank. The expected sign of these variables depends on the relative importance of each kind of business.

The last category of regressors comprises two variables called "Securities Interaction", standing for the securities issued by the borrower and held by the lender or vice-versa. These are proxies of the interactions between borrowers and lenders outside the interbank market, the idea being that, as in bank-firm relationships, the information that banks obtain by offering multiple services may be of value in lending (e.g. Degryse and Van Cayseele, 2000). The expected sign is therefore positive.

## 4. Results

### 4.1. First step: stability and existence

The results of the first step are reported in Table 5, which presents seven specifications, variously mixing the explanatory variables. Specification (1) is empty of regressors, and the focus is only on the value of the parameter $\varphi$ of equation (1.2); Specification (6) includes bank-by-bank dummies and the full range of regressors presented in Table 4; Specification (7) includes as regressors also the number of bank counterparties.

The first relevant outcome is that the parameter $\varphi$ is always significantly less than one, even when, as expected, it increases slightly owing to the addition of the explanatory variables. ${ }^{13}$

[^9]Therefore, interbank customer relationships exhibit negative duration dependence: they exist and are stable, because the probability of their ending or breaking off decreases over time.

The second lesson of this first step concerns the factors driving the probability of ending an interbank relationship. On the borrower side, the duration of interbank relationships is longer: first, if borrowers are well-capitalized and profitable (borrowers' variables Capital and ROE are significantly negative); second, if their business focuses more on fee-generating services than on interest-generating activities (Structure of Income/Opacity is significantly negative); third, if they are either non-rated or well-rated; fourth, if they are net lenders inside their domestic banking group or abroad (Intra-group Interbank Net Position and Non-Domestic Interbank Net Position are significantly negative); and finally if their lending activity is florid (Total Loans is significantly negative). On the contrary, the probability of ending an interbank relationship earlier increases if borrowers are large (Size is significantly positive) and if their liquidity is high in amount and volatility.

On the lender side, the duration of interbank relationships is longer if lenders are wellcapitalized, profitable, and liquid. But duration shortens if lenders are large, burdened with nonperforming loans, unrated, liquidity-volatile, or with investment directed to other business (Total Loans and Total Shares are significantly positive).

On the interaction side, the duration of interbank relationships increases if borrowers and lenders interact outside the interbank market. In Specification (7), I included as regressors the number of lenders (lending to borrowers) as well as the number of borrowers (borrowing from lenders). The sign of both regressors is significantly negative. This means that the probability of prolonging one's own interbank relationships increases with the number of counterparties.

All the specifications indicate that interbank relationships are long. During my sample period of 131 months, they lasted on average for 70 and 108 consecutive months, respectively, using Specification (7) and (1), and the average values of the explanatory variables. The duration of relationships among banks appears to be particularly long in view of the typically very short maturities of interbank exposures. To verify the robustness of this estimate, I repeated the first step after removing the small relationships, as one could conjecture that duration dependence may change with size of exposure. In an extreme case, banks might maintain some stable relationships but based on small quantities, while doing most of their interbank transactions with rotating counterparties. To control for this, I removed alternatively the exposures under the $10^{\text {th }}, 25^{\text {th }}$ and $50^{\text {th }}$ distribution percentile of SBI and SLI defined in equations (2.1) and (2.2). In all cases, $\varphi$ always remained
significantly less than one. The estimate of the duration diminished but never fell below 60 consecutive months.

Using Specifications (6) and (7), I also quantified the estimated effect of the different regressors on the expected duration of interbank relationships. The last columns of Table 5 report the change of duration in months when shifting from the $25^{\text {th }}$ to the $75^{\text {th }}$ percentile of the distribution of each regressor. For example, moving from the $25^{\text {th }}$ to the $75^{\text {th }}$ percentile of borrowers' Fund Raising, namely comparing two borrowers, one illiquid and the other liquid, the duration of interbank relationships decreases by 97 periods according to Specification (6) and by 66 according to (7). The other economically significant factors in lengthening duration are: both lenders' and borrowers' Total Loans; lenders' Fund Raising; and borrowers' rating and credit scores. Interestingly, a crucial lengthening role is also played by borrowers' Non-Domestic Interbank Net Position: transferring funds abroad does not diminish but actually extends the duration of interbank customer relationships.

### 4.2. Second step: strength and determinants

Table 6 reports the results of the second step for eight specifications, containing the same covariates for both SLI and SBI. ${ }^{14}$ Other estimations are described in the next Section as robustness checks. As is clear in Table 6, and as I explain in this and in the next Section, the results are robust. ${ }^{15}$

The same variables, both on the borrowers' and the lenders' side, often have different signs in the estimations of the SLI and SBI. This depends on the different role played by banks, on the one hand, as "substantial lenders" or "substantial borrowers", and, on the other hand, as "lenders of substantial borrowers" and "borrowers of substantial lenders". ${ }^{16}$

[^10]The first variable, Relationship Duration, which is always significantly positive, confirms the persistence of interbank relationships found in the first step and signals that the longer a relationship is, the more likely it is to be strong.

Taken together, the regressors associated with borrowers' agency problems show that although interbank customer relationships exist and persist, monitoring activity on borrowing banks seems to remain necessary. As mentioned, ex-ante one might reasonably argue that repeated interbank transactions would allow banks to assess one another and create mutual trust regardless of the short-term conditions. But my outcomes show that interbank customer relationships are based on the observable characteristics of borrowers. In fact, according to the SBI estimation, substantial borrowers tend to be chosen if they have larger Size, greater Capital and less Bad Loans. ${ }^{17}$

The regressors that proxy lending capacity show that substantial lenders have larger Size, lower Capital and a heavier burden of Bad Loans. This seems to suggest that poorly capitalized banks are more likely to be substantial interbank lenders because they are less likely to invest outside the interbank market. As a consequence, they have more bad loans, because they are less accustomed to or less skilled at monitoring the creditworthiness of their non-bank customers; yet they are unrated or well-rated (lenders' Banks without Rating is positive and Rating is negative), because they are likely to assume less risk outside the interbank market.

As far as liquidity is concerned, substantial borrowers tend to be those with sizeable liquidity needs due to both low Fund Raising and high Volatility of Liquidity. On the other hand, banks with high Fund Raising are not substantial lenders, as one might expect, confirming that these banks are more likely to search for more profitable investments outside the interbank market. However, substantial lenders do tend to have low Volatility of Liquidity. The picture remains consistent also as regards Liquidity Shocks Correlation. Borrowers tend to rely on substantial lenders with low Volatility of Liquidity and hence do not worry about Liquidity Shocks Correlation, which turns out to be positive (SLI estimation). In contrast, lenders tend to select substantial borrowers with high Volatility of Liquidity, provided that Liquidity Shocks Correlation is negative (SBI estimation).

The regressors linked to liquidity motivations confirm that when banks are substantial lenders, they are less involved in other kinds of businesses (in SLI, lenders' Total Loans, Non-

[^11]domestic Assets, and Total Shares are negative). At the same time, substantial borrowers rely on interbank relationships to finance all their activities (in SBI, the three borrowers' variables are positive). Moreover, the likelihood of being substantial borrowers increases when banks are net lenders inside a domestic group or abroad, because in such circumstances banks demand a comparatively large amount of funds from every lender in order to set up a stable financing source for themselves, the whole group, and their foreign counterparties. ${ }^{18}$

Finally, the two symmetrical variables Securities' Interaction usually have a positive and significant coefficient showing that interactions undertaken by banks outside the interbank market strengthen their relationship. ${ }^{19}$

### 4.3. Third step: During the crisis

As explained in Section 2, in order to verify whether interbank customer relationships have continued to exist, and how they functioned during the crisis, I split my entire sample period into two spans, before and after August 2007, the consensus date for the onset of the crisis, and repeated the exercises of the previous two steps.

The most significant conclusion is that interbank customer relationships survived the crisis. The parameter $\varphi$ is always significantly less than one for equations (1.1) and (1.2) over the months following the onset of the crisis (not reported). Nevertheless, banking practices have changed and adapted, as is shown by the reshaping of coefficients in the estimation of equations (2.1)-(2.3). Table 7 reports the results of Specification (8), chosen because it contains the full range of my explanatory variables. The effect of Relationship Duration is very noticeably unmodified after the meltdown, signalling that the length of the relationship remains a crucial factor in explaining when a bank is a substantial lender or borrower. By contrast, the sign or the statistical significance of some relevant determinants are different before and after the crisis.

First, after the crisis, substantial lenders are rated (in SLI, lenders’ dummy Banks without Rating is positive before the crisis and becomes negative after the crisis), and have worse ratings (the variable Rating becomes positive). However, they have higher capital, a higher level of liquidity, a larger amount of loans, and are less opaque. At the same time, borrowers of substantial lenders are

[^12]financed even if, or mainly because, they are in trouble, having less capital, worse ratings, lower ROE, and fewer loans. Moreover, they are financed regardless of bad loans or of being rated.

Second, after the crisis, substantial borrowers are picked out if they have easy-to-read balance sheets (in SBI, Structure of income/Opacity is insignificant before the crisis but becomes significant and negative after it) and higher profits, but with no regard for their rating, liquidity volatility and correlation. Moreover, the financing of substantial borrowers is unrelated or inversely related to the interactions outside the interbank market (in SBI, after the crisis, the two Securities' Interaction variables become, respectively, insignificant and negative). At the same time, lenders of substantial borrowers provide liquidity even if they have less capital, and regardless of their bad loans, structure of income, rating score, amount of loans and shares (these variables become insignificant).

As noted in the previous Section, the results of borrowers' rating and credit scores before and after the crisis are particularly interesting, and clarify the role of rating agencies in the selection of substantial borrowers. In fact, before the crisis, substantial borrowers were chosen either if they were unrated or, if rated, if they had good scores. On the contrary, after the crisis the presence of rating and credit scores become unimportant and substantial borrowers seem to be selected on the basis of a pure lender's assessment.

The marginal effects of the explanatory variables confirm this picture. Table 8 displays the percentage change that both indexes, SLI and SBI, undergo in moving from the $25^{\text {th }}$ to the $75^{\text {th }}$ distribution percentile of each regressor, before and after the crisis. In general, the main determinants are very similar to those concerning the duration of interbank relationships: Size, Fund Raising, Total Loans, rating, and credit scores. Like Furfine (2001), King (2008), and Angelini et al. (2011), I find that Capital and Bad Loans play a statistically significant yet economically modest role. Mainly, my results show that the length of relationships affects both SLI and SBI positively and powerfully, both before and after the crisis.

The marginal effects also confirm in terms of economic impact that after the crisis the healthier banks are willing to be substantial lenders and that troubled banks are not deprived of interbank financing. These outcomes corroborate the general predictions of the literature on customer relationships, while for example contradict the hypothesis of Acharya et al. (2008), who conjecture that it may be rational for banks with a liquidity surplus not to provide liquidity to needy banks, in hopes of picking up their assets at fire-sale prices.

## 5. Robustness checks

In addition to the checks described in the previous Sections, ${ }^{20}$ I tested the robustness of my results in several additional ways. ${ }^{21}$

### 5.1 Left and right censoring

Typical of this kind of analysis, my first step suffers from both left and right censoring, which may cause biased and inconsistent estimations (Heckman and Singer, 1984; Kiefer, 1988). Censoring arises because, in order to determine exactly when a relationship starts and ends, one must know its complete history (relationships that began prior to the dataset are left-censored, those continuing after the dataset are right-censored). In this regard, the advantage of my dataset is its length and frequency; my results are confirmed when estimations are carried out over different subsample periods; and right-censoring should not jeopardize my findings because, on the contrary, it presumably increased rather than decreased $\varphi$ in equation (1.2). Nonetheless, I again followed the strategy adopted by Ongena and Smith (2001), and added further checks, in order to assess the sensitivity of my outcomes to censoring. For left-censoring I used two methods: (i) rerunning the regressions on a large number of hypothetical new starting dates; and (ii) eliminating the leftcensored observations. For right-censoring, I used three methods: (i) expressing the log-likelihood function as a weighted average of the sample density of completed duration spans and the survivor function of uncompleted spans; (ii) eliminating the right-censored observations; and (iii) calculating the duration of each relationship by considering it either as ended or not after one month, two months or three months of interruption. In all cases, $\varphi$ remained smaller than 1 both on my entire sample period and after the crisis.

### 5.2 Different baseline hazard functions

[^13]In addition to the Weibull hazard function, I estimated equations (1.1)-(1.2) using as an alternative baseline hazard function for $\lambda_{0}(t)$ the log-logistic, which allows non-monotonic duration dependence. Consistent with my main results, this regression showed that interbank relationships are more likely to end very early, but later on continue to exhibit negative duration dependence. In any case, both the larger log likelihood and the smaller AIC values confirmed the preference for the Weibull model.

### 5.3 Controlling for endogeneity: discarding explanatory variables and IV estimations

One concern with the fixed effects estimator used in the second step is that the covariates should be strictly exogenous and thus should not depend upon the history of $\mathrm{I}_{i, j, t}$ in equation (2.3). To verify the stability of each explanatory variable, and in general to test for possible collinearity, I discarded, in turn, each of the regressors of the matrixes $\mathrm{K}_{i, t}^{\mathrm{L}}, \mathrm{K}_{j, t,}^{\mathrm{B}}$, and $\mathrm{K}^{\mathrm{LB}}{ }_{i, j, t}$. The results can be summarized as follows. First, only a few regressors exhibit less stability: there are only three in the SBI (borrowers' variables Size, Capital, and Volatility of Liquidity); and there are only two in the SLI (borrowers' Rating and lenders' Fund Raising). Second, these regressors never switch the statistical significance of their sign. Third, neither their inclusion nor their exclusion is apt to affect the other regressors. Fourth, the instability of these five variables would not seem to be due to an intrinsic weakness, but to the different roles played before and after the crisis. As a further robustness check, I employed the IV estimator for several variables, with a single IV estimator for each variable or a multiple endogenous regression, where an instrumental variable is included for each potential endogenous regressor. As a vector of instruments, I used either the other regressors or the same regressors computed with a two-quarter lag. The outcomes were always confirmed. ${ }^{22}$

### 5.4 Banking group consolidated data

One salient feature of the Italian banking system is the widespread presence of banking groups. I have already taken this fact into account because: (i) my key variables in all steps are constructed after eliminating interbank transactions involving banks belonging to the same group; (ii) I used the net intra-group position of each borrower as a control variable. Nevertheless, in order to verify that the composition and the needs of groups do not invalidate my outcomes, I used another, more radical, methodology, consolidating all the data of banks affiliated in the same groups,

[^14]thus transforming my bank-by-bank data into group-by-group data. In this way, I reran the regressions not for each bank $i$ on each other bank $j$, but for each group on each other group. Remarkably, in spite of a drastic reduction in the number of observations and minor changes in coefficients and their significance levels, all outcomes remained confirmed.

### 5.5 Changing start dates and time spans

In addition to the inclusion of a time dummy, in order to test the sensitivity of my results on different dates and periods, I employed many checks, in particular in the third step. First, I experimented with alternatives to August 2007 as the starting point of the meltdown (e.g. Taylor and Williamson, 2009). I brought forward the outset of the crisis by one or two months (the idea being that some indicators might have changed earlier); also, in the opposite direction, I postponed the crisis by one, two, three, or four months (the idea being that some indicators might have changed later); moreover, I considered the crisis as beginning in September 2008 (with the Lehman failure and exacerbation of the financial crisis). Second, in a similar way, I tested the stability of the results of the pre-crisis period, which is much longer in my sample, repeating the exercises on different and shorter pre-crisis sub-periods. In particular, I tested the results of my pre- and post-crisis comparison by juxtaposing two periods of the same length, that is, comparing the last 21 months prior to the critical point with my 21-month-long post-crisis period. ${ }^{23}$ In all cases, results remained stable.

### 5.6 Adding explanatory variables

In my exercises, I used four extra explanatory variables, which I chose not to display because their time-series are shorter or available for a much smaller sub-set of banks. The first additional regressor is the monthly percentage change in the price of listed banking shares, taken from the Italian Stock Exchange. Its effect turned out to be insignificant. Moreover, on average, there were only 30 listed banks in Italy during my sample period. The second is the 5 -year credit default swap, obtained from Datastream. Though interesting, this regressor conflicts with the credit rating and is only available for a handful of banks. The third supplementary regressor is interbank interest rates, calculated as monthly averages of daily data drawn from the $e$-MID, a multilateral screen-based trading facility on which banks electronically exchange interbank deposits and loans. As with the key variables, one can learn the identity of each borrower and lender, and how much each

[^15]intermediary pays or receives. The results indicate that borrowing banks, which pay a lower interest rate, rely more on interbank customer relationships. Nonetheless, while my data on quantities cover the whole Italian interbank market, including over-the-counter transactions, the data sourced from the $e$-MID cover only a small market share. The fourth additional regressor is the ratio of securitized loans to total assets, the idea being that securitizing banks have an additional channel to satisfy their liquidity needs (Affinito and Tagliaferri, 2010). However, the variable turns out not to be significant. ${ }^{24}$ In any case, the inclusion of these additional variables left the other results unaltered.

### 5.7 Secured interbank loans

An alternative hypothesis to explain the persistence of interbank relationships after the crisis is an increase in collateralized interbank lending. ${ }^{25}$ Moreover, the use of collateral could have affected my findings on other specific covariates. ${ }^{26}$ However, this hypothesis seems to be contradicted by the descriptive statistics. As Figure 6 shows, secured interbank exposures - as a share of total domestic inter-group interbank exposures - decreased starting in 2002, and this trend did not change in the post-crisis period. ${ }^{27}$ Nevertheless, I further checked this issue by running equations (1.1) - (2.3) after splitting the interbank inter-group exposures into unsecured and secured components, and handling in two alternative ways: either subtracting the secured loans from my dependent variables or using the ratio of secured to unsecured interbank exposures as an explanatory variable. The results in the two cases are equivalent. Table 9 reports an example of this kind of check for the second and third steps. Although the additional variable (secured/unsecured interbank exposures) is significantly positive, the results remain basically unchanged.

### 5.8 Contemporaneous borrowers and lenders

[^16]In my dataset, some pairs of banks lend to and borrow from each other at the same time. In order to verify whether such particular relationships depend on specific determinants, I repeated all my exercises both excluding this sub-sample of banks and restricting the analysis to it. All results were confirmed. In particular, in the second step limited to this sub-sample, I found that the variable Liquidity Shocks Correlation was always significantly negative, supporting the idea of Cocco et al. (2009) that customer relationships allow these banks always to insure against liquidity risk.

### 5.9 Outliers and quantile regressions

Results were confirmed when I allowed for outliers in the variables of my dataset, progressively removing 10,15 and 20 per cent of tail observations. Results were similar also running quantile regressions in all steps of my analysis, though the levels of significance did change a bit. This suggests that the existence and the determinants of interbank customer relationships do not change after different thresholds.

### 5.10 Cooperative banks and branches of foreign banks

A set of checks was performed on cooperative banks and branches of foreign banks, because these two types of institution are often regarded as dissimilar to other banks. The results remained stable removing both types from all steps of my analysis and then removing each of them in turn. ${ }^{28}$ Finally, I re-estimated my three steps alternatively on the two types of banks, even though the number of observations was now much smaller. The most interesting effect of this check was that $\varphi$ becomes greater than 1, indicating that interbank customer relationships do not exist, between pairs of banks that are both cooperative or both foreign, while they do exist in all other cases.

## 6. Conclusions

As far as I know, the existence of customer relationships between pairs of banks has never been explicitly tested, and it is now of particular interest in view of the recent financial crisis. The literature on bank-firm customer relationships predicts that banks ensure the availability of credit to customer firms mainly during crises or in any case when the latter are in trouble. This paper shows that this also holds when both borrower and lender are banks. Therefore, interbank customer relationships may well be one of the reasons why in Italy during the 2007-2009 financial crisis banks did not lose mutual trust and inter-group domestic interbank exposures did not decline. This outcome

[^17]carries a relevant policy implication, in that it suggests that mutual confidential knowledge among banks and stable interbank relationships facilitate the reallocation of liquidity among banks even in crisis situations. The paper also analyzed the determinants of the duration of interbank customer relationships and the characteristics of the borrowing and lending banks that rely more heavily on interbank customer relationships. The main findings can be briefly summarized.

First, in Italy interbank customer relationships exist and are durable. My data show that, during a sample period of 11 years, they lasted on average at least 5 consecutive years. The duration of interbank relationships is longer if borrowing banks are illiquid, small, unrated or well-rated, and if they engage heavily in lending to firms, households and foreign intermediaries. As to lenders, duration is longer if lending banks are liquid, well-capitalized, and less heavily engaged in other kinds of business. On both the borrowing and the lending side, duration is likely to be greater where banks have connections with a greater number of counterparties.

Second, substantial interbank borrowers and lenders have definable characteristics. Substantial interbank borrowers tend to be large in size and to have high and volatile liquidity needs. Their capitalization is solid, their loan portfolio appears safe, and their business is successful and multifaceted: loans, shares, and non-domestic investments are high. Moreover, when banks are net lenders inside their domestic group or abroad, the probability of being a substantial interbank borrower increases. Substantial lenders are not the most liquid banks, have less lending, shares, and foreign business, and as a consequence they do not need to be highly capitalized, although have good ratings.

Third, in times of financial stability banks seem to select each other on the basis of observable and testable monitoring factors and indicators and use the judgments of rating agencies as a tool for selection.

Fourth, after the outbreak of the crisis, however, the presence and level of ratings become irrelevant, and borrowing banks seem to be selected on the basis of a pre-existing relationship, not on observable indicators, which indeed signal situations of difficulty. Moreover, not only did the crisis fail to impede interbank customer relationships, it actually made healthier banks willing to be substantial interbank lenders and allowed lender banks not to deprive their counterparties of interbank funds. These outcomes confirm for interbank customer relationships the consensus thesis of the literature on bank-firm customer relationships.

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## Figures and Tables

Table 1. Summary statistics of key variables: duration and strength of interbank customer relationships

| Step | Name | Definition | Obs | Mean | Sd.Dev. | Min | 25 | 75 | Max |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $1^{\text {st }}$ (and $3^{\text {th }}$ ): duration of interbank customer relationships | Duration or span: <br> span that passes before the interbank relationship between each pair of banks ends or breaks | a) Computed as the average of the ongoing duration in each period ( $T s$ in equation 1.1) | 417,360 | 28.11 | 29.09 | 1 | 7 | 41 | 131 |
|  |  | b) Computed as the average of the final duration of all relationships | 417,360 | 47.63 | 36.67 | 1 | 17 | 67 | 131 |
|  |  | c) Computed as the average of the final duration of the longest relationship of each bank | 417,360 | 96.06 | 40.19 | 1 | 61 | 130 | 131 |
| $2^{\text {nd }}$ (and $3^{\text {th }}$ ): <br> strength of interbank customer relationships | SLI - Relevant Lender Index (equation 2.1) | Total loans from each $j$ to each $i$ / Total interbank loans to each $i$ | 460,964 | 0.13 | 0.27 | 0 | 0.01 | 0.27 | 1 |
|  | SBI - Relevant Borrower Index (equation 2.2) | Total loans from each $i$ to each $j$ / Total interbank loans from each $i$ | 460,964 | 0.19 | 0.33 | 0 | 0.01 | 0.36 | 1 |
| $2^{\text {nd }}$ (and $3^{\text {th }}$ ): strength of interbank customer relationships | Number of lenders | Inverse of the alternative measure of SLI: one / number of banks that $i$ borrows from during each period | 460,964 | 8.07 | 22.46 | 1 | 1 | 5 | 77 |
|  | Number of borrowers | Inverse of the alternative measure of SBI: one / number of banks that $i$ lends to during each period | 460,964 | 5.25 | 12.83 | 1 | 1 | 3 | 60 |

Table 2. Relations among key variables

| Variables |  |  | Number of borrowers 1 | Number of lenders | SBI | SLI | $T_{S}$ (span) |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  | average |  |  |  | max |
| computed as, first the total number of borrowers for each lender in each period, and then the average at the same time cross-section and over time |  | $1^{\text {st }}$ quartile |  |  | 1 |  | 65 | 103 |
|  |  | $2^{\text {nd }}$ quartile |  | 2 |  | 0.50 |  | 53 | 106 |
|  |  | $3^{\text {rd }}$ quartile | 3 |  | 0.33 |  | 40 | 102 |
|  |  | $4^{\text {ti }}$ quartile | 17.98 |  | 0.12 |  | 22 | 96 |
| Number of lenders <br> computed as, first the total number of lenders for each borrower in each period, and then the average at the same time cross-section and over time |  | $1^{\text {st }}$ quartile |  | 1 |  | 1 | 60 | 106 |
|  |  | $2^{\text {nd }}$ quartile |  | 2 |  | 0.50 | 40 | 99 |
|  |  | $3^{\text {rd }}$ quartile |  | 4 |  | 0.28 | 29 | 86 |
|  |  | $4^{\text {tin }}$ quartile |  | 27.58 |  | 0.07 | 25 | 93 |
| SBI <br> computed as, first the average value by lender and period, and then the average at the same time crosssection and over time |  | $1^{\text {st }}$ quartile | 14.30 |  | 0.17 |  | 26 | 97 |
|  |  | $2^{\text {nd }}$ quartile | 2 |  | 0.50 |  | 53 | 106 |
|  |  | $3^{\text {rd }}$ quartile | 1 |  | 1 |  | 65 | 103 |
|  |  | $4^{\text {th }}$ quartile | 1 |  | 1 |  | 65 | 103 |
| SLI <br> computed as, first the average value by borrower and period, and then the average at the same time crosssection and over time |  | $1^{\text {st }}$ quartile |  | 25.60 |  | 0.08 | 20 | 92 |
|  |  | $2^{\text {nd }}$ quartile |  | 2.51 |  | 0.43 | 35 | 95 |
|  |  | $3^{\text {rd }}$ quartile |  | 1 |  | 1 | 60 | 106 |
|  |  | $4^{\text {tin }}$ quartile |  | 1 |  | 1 | 60 | -106 |
|  | Average <br> computed as, first the final duration of each relationship, and then average of the final duration of all relationships | $1^{\text {st }}$ quartile | 6.40 | 8.12 | 0.43 | 0.40 | 10 | 56 |
|  |  | $2^{\text {nd }}$ quartile | 10.13 | 14.30 | 0.47 | 0.43 | 27 | 90 |
|  |  | $3^{\text {rd }}$ quartile | 3.82 | 6.48 | 0.76 | 0.80 | 53 | 115 |
|  |  | $4^{\text {th }}$ quartile | 1.37 | 1.22 | 0.84 | 0.91 | 101 | 124 |
|  | Max | $1^{\text {st }}$ quartile | 3.72 | 6.12 | 0.65 | 0.53 | 17 | 35 |
|  | computed as, first the final duration of each | $2^{\text {nd }}$ quartile | 6.85 | 9.82 | 0.52 | 0.48 | 41 | 93 |
|  | relationship, and then average of the final duration of each bank's longest relationship | $3^{\text {rd }}$ quartile | 5.10 | 8.12 | 0.69 | 0.70 | 66 | 129 |
|  |  | $4^{\text {th }}$ quartile | 5.10 | 8.12 | 0.69 | 0.70 | 66 | 129 |

Figure 1. Interbank loans in Italy
(end-of-month stocks in millions of euros)


Figure 2. Interbank loans in Italy
(end-of-month percentage share on total assets)


Figure 3. SLI and SBI, computed on end-of-month exposures (average values in each month)


Figure 4. Average number of banks lending to and borrowing from each bank
(average values in each month; equivalent to the inverses of SLI and SBI, computed on the number of relationships)


Figure 5. Distribution of final duration of interbank customer relationships in my sample


Upper panels report distribution of final duration as percentage shares of number of banks; lower panel as percentage shares of interbank market exposures.
Left side reports duration in terms of number of months; right side as a percentage of the effective presence in the interbank market.

Table 3. Summary statistics of explanatory variables

| Type | Name | Definition | Source | Obs | Mean | Sd. Dev. | Min | 25 | 75 | Max |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| borrower |  |  |  |  |  |  |  |  |  |  |
| Agency problems | Size | Log (Total assets) | Bank of Italy | 456,099 | 8.30 | 1.92 | 0 | 7.11 | 9.56 | 12.97 |
|  | Capital | Capital / Total assets | Bank of taly | 453,247 | 0.09 | 0.07 | 0.01 | 0.05 | 0.10 | 1 |
|  | Bad loans | Bad loans / Total loans | Bank of Italy | 454,373 | 0.05 | 0.09 | 0 | 0.01 | 0.06 | 1 |
|  | Structure of income/Opacity | Non-interest income / Net interest income | Bank of Italy | 439,170 | 1.41 | 15.53 | 0 | 1.25 | 1.87 | 4.6 |
|  | Banks without rating (0-1) | Banks without rating (0-1) | The rating agency Fitch through the database of Bloomberg | 460,964 | 0.51 | 0.50 | 0 | 0 | 1 | 1 |
|  | Rating | Rating agency scores | The rating agency Fitch through the database of Bloomberg | 385,061 | 8.29 | 3.30 | 2 | 5 | 11 | 11 |
|  | ROE | Net profits / Capital | Bank of taly | 438,081 | 0.17 | 11.24 | 0 | 0.00 | 0.05 | 0.34 |
| Liquidity needs | Funds Raising | Total deposits and bonds / Total assets | Bank of Italy | 456,099 | 0.49 | 0.26 | 0 | 0.25 | 0.70 | 1 |
|  | Volatility of Liquidity | Coefficient variation of balance sheet items measuring banking liquidity: deposits, bonds issued, and euro-area Government securities held in portfolio | Bank of Italy | 458,147 | 0.03 | 0.03 | 0 | 0.01 | 0.03 | 0.916 |
| Liquidity motivations | Total loans | Total loans / Total assets | Bank of Italy | 456,099 | 0.47 | 0.25 | 0 | 0.30 | 0.65 | 1 |
|  | Non-domestic assets | Non-domestic assets / Total assets | Bank of Italy | 456,099 | 0.03 | 0.04 | 0 | 0.00 | 0.03 | 0.93 |
|  | Total shares | Total shares / Total assets | Bank of Italy | 456,099 | 0.04 | 0.06 | 0 | 0.01 | 0.05 | 1 |
|  | Intra-group interbank net-position | Intra-group interbank net-position | Bank of Italy | 426,739 | 0.01 | 0.25 | -1 | 0.00 | 0.03 | 1 |
|  | Non-domestic interbank net-position | Non-domestic interbank net-position | Bank of Italy | 426,739 | -0.07 | 0.28 | -1 | 0.22 | 0.04 | 1 |
| lender |  |  |  |  |  |  |  |  |  |  |
| Lending capacity | Size | Log (Total assets) | Bank of Italy | 458,574 | 8.36 | 1.93 | 0 | 7.14 | 9.65 | 12.97 |
|  | Capital | Capital / Total assets | Bank of Italy | 457,340 | 0.09 | 0.07 | 0.01 | 0.05 | 0.10 | 1 |
|  | Bad loans | Bad loans / Total loans | Bank of Italy | 456,482 | 0.05 | 0.08 | 0 | 0.01 | 0.06 | 1 |
|  | Structure of income/Opacity | Non-interest income / Net interest income | Bank of Italy | 445,772 | 1.50 | 15.70 | 0 | 1.29 | 1.88 | 3.1 |
|  | Banks without rating (0-1) | Banks without rating (0-1) | The rating agency Fitch through the database of Bloomberg | 460,964 | 0.46 | 0.50 | 0 | 0 | 1 | 1 |
|  | Rating | Rating agency scores | The rating agency Fitch through the database of Bloomberg | 402,523 | 7.97 | 3.36 | 2 | 5 | 11 | 11 |
|  | ROE | Net profits / Capital | Bank of Italy | 448,941 | 0.19 | 12.76 | 0 | 0.00 | 0.05 | 0.34 |
| Liquidity provisions | Funds Raising | Total deposits and bonds / Total assets | Bank of Italy | 458,574 | 0.50 | 0.25 | 0 | 0.29 | 0.70 | 1 |
|  | Volatility of Liquidity | Coefficient variation of balance sheet items measuring banking liquidity: deposits, bonds issued, and euro-area Government securities held in portfolio | Bank of Italy | 460,915 | 0.03 | 0.03 | 0 | 0.01 | 0.03 | 0.944 |
| Liquidity motivations | Total loans | Total loans / Total assets | Bank of Italy | 458,574 | 0.47 | 0.25 | 0 | 0.31 | 0.65 | 1 |
|  | Non-domestic assets | Non-domestic assets / Total assets | Bank of Italy | 458,574 | 0.03 | 0.04 | 0 | 0.00 | 0.03 | 0.909 |
|  | Total shares | Total shares / Total assets | Bank of Italy | 458,574 | 0.04 | 0.06 | 0 | 0.01 | 0.05 | 0.949 |
| borrower and lender |  |  |  |  |  |  |  |  |  |  |
| Duration | Lending relationship duration | Number of consecutive months since the start of lending relationship between each pair of banks | Bank of Italy | 460,964 | 26.21 | 29.24 | 0 | 4 | 38 | 131 |
|  | Borrowing relationship duration | Number of consecutive months since the start of borrowing relationship between each pair of banks | Bank of Italy | 460,964 | 26.41 | 29.61 | 0 | 4 | 38 | 131 |
| Liquidity | Liquidity shocks correlation | Correlation between the liquidity shocks of each pair of banks | Bank of Italy | 447,448 | 0.05 | 0.52 | -1 | -0.29 | 0.42 | 1 |
| Interaction outside the interbank market | Securities Interaction (lender vs.borrower) | Securities held by the lender issued by the borrower/ Total securities held by the lender issued by banks | Bank of Italy | 458,574 | 0.14 | 0.34 | 0 | 0 | 0.03 | 1 |
|  | Securities Interaction (borrower vs. lender) | Securities held by the borrower issued by the lender / Total securities held by the borrower issued by banks | Bank of Italy | 459,723 | 0.21 | 0.40 | 0 | 0 | 0.05 | 1 |

Table 4. Explanatory variables: matrixes and effects

| Matrix $\rightarrow$ | $\mathbf{K}^{\mathbf{B}}{ }_{\mathrm{j}, \mathrm{t}}$ | $\mathbf{K}^{\mathbf{L}, \mathrm{t}}$ | $\mathbf{K L}{ }^{\text {i, }}$, $\mathrm{t}_{\text {t }}$ |
| :---: | :---: | :---: | :---: |
| $\downarrow$ Effect | borrower's regressors | lender's regressors | borrower's and lender's regressors |
| (1) <br> Persistency |  |  | Relationship Duration |
| (2) Agency problems | Size |  |  |
|  | Capital |  |  |
|  | Bad Loans |  |  |
|  | Opacity |  |  |
|  | Banks without Rating |  |  |
|  | Rating |  |  |
|  | ROE |  |  |
| (3) <br> Lending capacity |  | Size |  |
|  |  | Capital |  |
|  |  | Bad Loans |  |
|  |  | Opacity |  |
|  |  | Banks without Rating |  |
|  |  | Rating |  |
|  |  | ROE |  |
| (4) <br> Liquidity situation | Fund Raising | Fund Raising | Liquidity Shock Correlation |
|  | Volatility of Liquidity | Volatility of Liquidity |  |
| (5) <br> Liquidity motivations | Total Loans | Total Loans |  |
|  | Non-Domestic Assets | Non-Domestic Assets |  |
|  | Total Shares | Total Shares |  |
|  | Intra-Group <br> Interbank Net-Position |  |  |
|  | Non-Domestic Interbank Net-Position |  |  |
| (6) <br> Interaction outside the interbank market |  |  | Borrower-lender Securities Interaction |
|  |  |  | Lender-borrower Securities Interaction |

Table 5．First step：stability and existence of interbank customer relationship

| Variables |  |  | estimations |  |  |  |  |  |  | marginal effects |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  | （1） | （2） | （3） | （4） | （5） | （6） | （7） | （6） | （7） |
|  |  | $\varphi$ | $\begin{aligned} & 0.576^{* * *} \\ & 0.003 \end{aligned}$ | $\begin{aligned} & 0.608^{* * *} \\ & 0.004 \end{aligned}$ | $\begin{aligned} & 0.618^{* * *} \\ & 0.004 \end{aligned}$ | $\begin{aligned} & 0.626^{* * *} \\ & 0.004 \end{aligned}$ | $\begin{aligned} & 0.634 * * * \\ & 0.004 \end{aligned}$ | $\begin{aligned} & 0.644^{* * *} \\ & 0.004 \end{aligned}$ | $\begin{aligned} & 0.638^{* * *} \\ & 0.005 \end{aligned}$ |  |  |
| $\begin{array}{\|c} \frac{\pi}{0} \\ 0 \\ 0.3 \\ 0 \\ 0 \end{array}$ |  | Size <br> Capital <br> Bad loans <br> Structure of income／Opacity <br> Banks without rating（0－1） <br> Rating <br> ROE |  | $\begin{gathered} 1.218 * * * \\ 0.007 \\ -0.568 * \\ 0.183 \end{gathered}$ | $\begin{aligned} & 1.1633^{* * *} \\ & 0.008 \\ & -0.543 * \\ & 0.184 \end{aligned}$ | $\begin{aligned} & 1.253 \text { *** } \\ & 0.011 \\ & -0.452 \text { ** } \\ & 0.146 \\ & \\ & \\ & \\ & -0.7199^{* * *} \\ & 0.070 \\ & 1.090^{* * *} \\ & 0.016 \end{aligned}$ | $\begin{aligned} & 1.198 * * * \\ & 0.011 \\ & -0.421 * * \\ & 0.142 \\ & \\ & \\ & -0.797 * * \\ & 0.082 \\ & 1.072 * * * \\ & 0.017 \end{aligned}$ | $\begin{gathered} 1.178 \text { *** } \\ 0.013 \\ -0.111 \text { *** } \\ 0.049 \\ 0.930 ~ n s \\ 0.142 \\ -0.998 * * \\ 0.001 \\ -0.714 * * * \\ 0.082 \\ 1.077 * * * \\ 0.018 \\ -0.999 * * \\ 0.001 \end{gathered}$ | $\begin{gathered} 1.209 \text { *** } \\ 0.016 \\ -0.195 \text { *** } \\ 0.085 \\ 0.856 ~ n s \\ 0.122 \\ -0.998 ~ * * \\ 0.001 \\ -0.673 ~ * * * \\ 0.078 \\ 1.104 ~ * * * \\ 0.019 \\ -0.999 \\ 0.001 \\ 0.0 \end{gathered}$ | $-31$ <br> 5 <br> ns <br> 1 <br> 61 <br> $-33$ <br> 1 | -10 5 ns 1 37 -21 1 |
|  |  | Funds Raising <br> Volatility of Liquidity |  | $\begin{aligned} & 6.452 \text { *** } \\ & 0.541 \end{aligned}$ | $\begin{aligned} & 6.749 \text { *** } \\ & 0.584 \end{aligned}$ | $\begin{gathered} 4.692 \text { *** } \\ 0.383 \end{gathered}$ | $\begin{aligned} & 5.049 \\ & 0.425 \end{aligned}$ | $\begin{aligned} & 6.154^{* * *} \\ & 0.569 \\ & 5.339^{* * *} \\ & 2.303^{2} \\ & \hline . . . . . . . . . . . . . . . . . . . . . ~ \end{aligned}$ | $\begin{aligned} & 5.244^{* * *} \\ & 0.470 \\ & 2.972 * * \\ & 1.285 \end{aligned}$ | -97 -7 | -66 -5 |
|  |  | Total loans <br> Non－domestic assets <br> Total shares <br> Within－group interbank net－position <br> Non－domestic interbank net－position |  | $-0.2622^{* *}$ | $-0.295 * * *$ | $\begin{gathered} -0.208 \text { *** } \\ 0.014 \end{gathered}$ | $-0.230 \text { *** }$ | $\begin{gathered} -0.142 \text { *** } \\ 0.013 \\ 0.555 \mathrm{~ns} \\ 0.210 \\ 1.174 \mathrm{~ns} \\ 0.319 \\ -0.164 \\ 0.010 \\ -0.171 \\ 0.009 \\ 0.009 \\ \hline \end{gathered}$ | $\begin{gathered} -0.127 \text { *** } \\ 0.011 \\ 0.132 \mathrm{~ns} \\ 0.050 \\ 0.747 \mathrm{~ns} \\ 0.207 \\ -0.206 \text { *** } \\ 0.012 \\ -0.211 \text { *** } \\ 0.012 \\ \hline-.0 . \end{gathered}$ | 52 <br> ns <br> ns <br> 5 <br> 44 | 37 <br> ns <br> ns <br> 3 <br> 29 |
|  |  | Number of lenders |  |  |  |  |  |  | $\begin{aligned} & -0.991 * * * \\ & 0.001 \end{aligned}$ |  | 7 |
| 芯 |  | Size <br> Capital <br> Bad loans <br> Structure of income／Opacity <br> Banks without rating <br> （0－1） <br> Rating <br> ROE |  | $\begin{gathered} 1.193^{* * *} \\ 0.008 \\ -0.299^{* * *} \\ 0.069 \end{gathered}$ | $\begin{aligned} & 1.266^{* * *} \\ & 0.011 \\ & -0.103^{* * *} \\ & 0.029 \\ & \\ & \\ & \\ & 1.026 \mathrm{~ns} \\ & 0.099 \\ & 1.055^{* * *} \\ & 0.015 \end{aligned}$ | $\begin{aligned} & 1.1455^{* * *} \\ & 0.008 \\ & -0.296^{* * *} \\ & 0.070 \end{aligned}$ | $\begin{aligned} & 1.212 * * * \\ & 0.011 \\ & -0.118 * * * \\ & 0.034 \\ & \\ & \\ & \\ & 1.073 \mathrm{~ns} \\ & 0.109 \\ & 1.042 * * * \\ & 0.015 \end{aligned}$ | $\begin{aligned} & 1.149 \text { *** } \\ & 0.012 \\ & -0.021 * * * \\ & 0.007 \\ & 3.304 * * * \\ & 0.425 \\ & 0.998 \mathrm{~ns} \\ & 0.002 \\ & 1.488 * * * \\ & 0.155 \\ & 0.991 \mathrm{~ns} \\ & 0.015 \\ & -0.996 * * * \\ & 0.001 \end{aligned}$ | $\begin{aligned} & 1.305 \text { *** } \\ & 0.016 \\ & -0.019 * * * \\ & 0.008 \\ & 2.379 * * * \\ & 0.302 \\ & 0.999 \mathrm{~ns} \\ & 0.001 \\ & 0.878 \mathrm{~ns} \\ & 0.096 \\ & 1.095 * * * \\ & 0.017 \\ & -0.995 * \\ & 0.004 \end{aligned}$ | $-11$ <br> 27 <br> －3 <br> ns <br> 2 <br> ns | -8 17 -2 ns ns 2 |
|  |  | Funds Raising <br> Volatility of Liquidity |  | $-0.511^{* * *}$ | $\begin{array}{r} -0.4933^{* * *} \\ 0.028 \end{array}$ | $-0.6866^{* * *}$ | $\begin{gathered} -0.6622^{* * *} \\ 0.039 \end{gathered}$ | $\begin{gathered} -0.679 * * * \\ 0.046 \\ 12.591 * * * \\ 3.380 \\ 3 \end{gathered}$ | $\begin{gathered} -0.619 * * * \\ 0.041 \\ 5.073 \text { *** } \\ 1.400 \\ . . . . . . . . . . . . . . . . . . . . . . . ~ \end{gathered}$ | 47 -10 | 25 -7 |
|  |  | Total loans <br> Non－domestic assets <br> Total shares |  | $\begin{aligned} & 2.713 * * * \\ & 0.151 \end{aligned}$ | $\begin{aligned} & 1.878 \text { *** } \\ & 0.112 \end{aligned}$ | $\begin{aligned} & 2.543 \text { *** } \\ & 0.147 \end{aligned}$ | $\begin{aligned} & 1.790 \text { *** } \\ & 0.111 \end{aligned}$ | $\begin{gathered} 2.969 * * * \\ 0.224 \\ 0.977 \mathrm{~ns} \\ 0.369 \\ 24.198 * * * \\ 7.884 \end{gathered}$ | $\begin{aligned} & 1.786^{* * *} \\ & 0.133 \\ & 0.246 \mathrm{~ns} \\ & 0.097 \\ & 6.850^{* * *} \\ & 2.206 \end{aligned}$ | $-87$ <br> ns <br> －21 | －56 <br> ns $-15$ |
|  |  | Number of borrowers |  |  |  |  |  |  | $\begin{aligned} & -0.979 \text { *** } \\ & 0.001 \end{aligned}$ |  | 19 |
| 坒 | $$ | Liquidity shocks correlation |  | $\begin{aligned} & 1.069 \text { ** } \\ & 0.035 \end{aligned}$ | $\begin{aligned} & 1.047 \mathrm{~ns} \\ & 0.035 \\ & . . . . . . . . . . . . . . . . . . . . . ~ \end{aligned}$ | $\begin{aligned} & 1.006 \mathrm{~ns} \\ & 0.033 \\ & \text {....................... } \end{aligned}$ | $\begin{aligned} & 0.984 \mathrm{~ns} \\ & 0.034 \\ & \text {...................... } \end{aligned}$ | $\begin{aligned} & 1.023 \mathrm{~ns} \\ & 0.036 \\ & \hline \end{aligned}$ | $\begin{aligned} & 0.980 \mathrm{~ns} \\ & 0.035 \\ & \text {...................... } \end{aligned}$ | ns | ns |
| \％ |  | Securities Interaction （borrower vs．lender） Securities Interaction （lender vs．borrower） |  | $\begin{gathered} -0.631 * * * \\ 0.033 \\ -0.527 \text { *** } \\ 0.025 \end{gathered}$ | $\begin{gathered} -0.605 \\ 0.035 \\ -0.552 \\ 0.026 \\ 0.026 \end{gathered}$ | $\begin{gathered} -0.598 * * * \\ 0.032 \\ -0.574 * * * \\ 0.030 \\ \hline \end{gathered}$ | $\begin{gathered} -0.572 * * * \\ 0.033 \\ -0.593 * * * \\ 0.031 \end{gathered}$ | $\begin{gathered} -0.590^{* * *} \\ 0.037 \\ -0.603 \\ 0.035 \end{gathered}$ | $\begin{gathered} -0.499^{* * *} \\ 0.033 \\ -0.453 \\ 0.027 \\ 0.0 * \\ \hline \end{gathered}$ | 2 1 | 1 1 |
| Counterpart dummies Constant <br> Number of observations |  |  | $\begin{gathered} -0.551^{* * *} \\ 0.005 \\ 417,360 \\ \hline \end{gathered}$ | $\begin{aligned} & y e s \\ & -0.497 \\ & 0.006 \\ & 389,585 \end{aligned}$ | $\begin{aligned} & y e s \\ & -0.481 * * * \\ & 0.006 \\ & 340,254 \end{aligned}$ | $\begin{aligned} & y e s \\ & -0.469 * * * \\ & 0.006 \\ & 317,745 \end{aligned}$ | $\begin{aligned} & \text { yes } \\ & -0.456 ~ * * * \\ & 0.007 \\ & 273,197 \\ & \hline \end{aligned}$ | $\begin{aligned} & y e s \\ & -0.439 \\ & 0.007 \\ & 270,028 \end{aligned}$ | $\begin{aligned} & y e s \\ & -0.450 \\ & 0.007 \\ & 249,053 \end{aligned}$ |  |  |

With regard to estimations，Table 5 reports the signs，hazard ratios，robust standard errors in italics，and statistical significance．Due to the inverse relationship between duration and the hazard rate，a negative sign of regressors indicates a longer duration，and a positive sign implies a shorter duration．With regard to marginal effects，Table reports the change of duration in number of months passing from the 25 th to the 75 th distribution percentile of each regressor（only for Specification（6）and（7）．${ }^{* * *}$ ，${ }^{* *}$ ，and 的enote statistical significance at 1,5 and $10 \%$ level；ns means not－significant．

Table 6. Second step: strength and determinants


Table reports regression coefficients and associated standard errors in italics. ${ }^{* * *}$, ${ }^{* *}$, and ${ }^{*}$ denote statistical significance at 1,5 and $10 \%$ level

Table 7: Third step: over the crisis - statistical significance

|  |  | SLI |  |  | SBI |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Total period | pre-crisis | post-crisis | Total period | pre-crisis | post-crisis |
| borrower |  |  |  |  |  |  |  |
| Agency problems | Size <br> Capital <br> Bad loans <br> Structure of income/Opacity <br> Banks without rating (0-1) <br> Rating <br> ROE | $\begin{gathered} \hline-0.034^{* * *} \\ 0.001 \\ 0.210 \text { *** } \\ 0.014 \\ 0.037 \text { *** } \\ 0.008 \\ 0.000 \text { *** } \\ 0.000 \\ -0.063 \text { *** } \\ 0.004 \\ 0.000 \\ 0.001 \\ 0.000 \\ 0.000 \end{gathered}$ | $\begin{gathered} \hline-0.033^{* * *} \\ 0.001 \\ 0.243 * * * \\ 0.015 \\ 0.040^{* * *} \\ 0.008 \\ 0.000 \\ 0.000 \\ -0.0633^{* * *} \\ 0.004 \\ 0.000 \\ 0.001 \\ 0.000 \\ 0.000 \end{gathered}$ | $-0.052 * * *$ 0.008 $-0.154 *$ 0.091 0.077 0.048 0.000 0.000 -0.019 0.028 $0.008 * *$ 0.004 $-0.025 *$ 0.013 | 0.001 0.001 -0.017 0.015 -0.052 *** 0.008 0.000 0.000 -0.033 *** 0.004 $0.005 * * *$ 0.001 0.000 0.000 | $0.0033^{* *}$ 0.001 -0.002 0.016 $-0.045^{* * *}$ 0.008 0.000 0.000 $0.012 * * *$ 0.004 $-0.002 * * *$ 0.001 0.000 0.000 | -0.004 0.007 -0.005 0.083 $-0.117{ }^{* *}$ 0.047 $-0.001 \quad * * *$ 0.000 -0.018 0.025 0.005 0.003 $0.032 * * *$ 0.011 |
| Liquidity needs | Fund Raising <br> Volatility of Liquidity | $\begin{gathered} 0.064^{* * *} \\ 0.004^{*} \\ -0.083^{* * *} \\ 0.011 \end{gathered}$ | $\begin{gathered} 0.031^{* * *} \\ 0.004^{* *} \\ -0.077^{* * *} \\ 0.012 \end{gathered}$ | $\begin{gathered} 0_{0.261 ~} \text { *** } \\ 0.021 \\ -0.110^{* * *} \\ 0.024^{2} \end{gathered}$ | $\begin{gathered} \hline-0.038^{* * *} \\ 0.004 \\ 0.019 * \\ 0.011 \end{gathered}$ | $\begin{gathered} \hline-0.040^{* * *} \\ 0.004^{* *} \\ 0.034^{* * *} \\ 0.012 \end{gathered}$ | $\begin{gathered} \hline-0.049^{* * *} \\ 0.015 \\ 0.029 \\ 0.024 \\ \hline \end{gathered}$ |
| Liquidity motivations | Total loans <br> Non-domestic assets <br> Total shares <br> Intra-group interbank net-position <br> Non-domestic interbank net-position | $\begin{gathered} 0.054^{* * *} \\ 0.003 \\ -0.166^{* * *} \\ 0.009 \\ -0.139 \\ 0.012 \\ -0.040 \\ 0.002 \\ -0.035 \\ 0.001 \\ \hline \end{gathered}$ | $\begin{gathered} 0.055^{* * *} \\ 0.004^{2} \\ -0.158 * * * \\ 0.010 \\ -0.1355^{* * *} \\ 0.013 \\ -0.0377^{* * *} \\ 0.002 \\ -0.031 * * * \\ 0.002 \\ \hline \end{gathered}$ | $-0.066^{* * *}$ <br> 0.020 <br> $-0.209^{* * *}$ <br> $0.044^{*}$ <br> $-0.111^{*}$ <br> 0.057 <br> $-0.134^{* * *}$ <br> 0.008 <br> $-0.089^{* * *}$ <br> 0.005 | $0.021^{* * *}$ $0.003^{2}$ $0.029^{* * *}$ $0.010^{* * *}$ $0.048^{* * *}$ 0.012 $0.010^{* * *}$ 0.002 $0.007^{* * *}$ 0.001 | $0.041^{* * *}$ <br> $0.004^{* *}$ <br> $0.026^{* *}$ <br> 0.010 <br> -0.003 <br> $0.014^{* * *}$ <br> $0.009{ }^{* * *}$ <br> 0.002 <br> 0.002 <br> 0.002 | -0.003 <br> 0.016 <br> $0.085^{* *}$ <br> 0.039 <br> 0.068 <br> 0.047 <br> $0.0188^{* * *}$ <br> 0.006 <br> $0.030^{* * *}$ <br> 0.004 |
| lender |  |  |  |  |  |  |  |
| Lending capacity | Size <br> Capital <br> Bad loans <br> Structure of income/Opacity <br> Banks without rating (0-1) <br> Rating <br> ROE | $\begin{gathered} \hline 0.019 \text { *** } \\ 0.001 \\ -0.055^{* * *} \\ 0.007 \\ 0.027 \text { *** } \\ 0.007 \\ 0.000 \\ 0.000 \\ 0.027 \text { *** } \\ 0.004 \\ -0.006 \text { *** } \\ 0.001 \\ 0.000 \\ 0.000 \end{gathered}$ | $\begin{gathered} \hline 0.011^{* * *} \\ 0.001 \\ -0.061 ~ * * * \\ 0.007 \\ 0.0266^{* * *} \\ 0.007 \\ 0.001 ~ * * * \\ 0.000 \\ 0.0199^{* * *} \\ 0.004 \\ -0.005{ }^{* * *} \\ 0.001 \\ 0.000 \\ 0.000 \end{gathered}$ | $\begin{gathered} \hline 0.057 \text { *** } \\ 0.008 \\ 0.131 * \\ 0.068 \\ 0.197 \text { *** } \\ 0.053 \\ -0.001 \text { *** } \\ 0.000 \\ -0.118 ~ * * * \\ 0.032 \\ 0.017 * * * \\ 0.004 \\ 0.000 \\ 0.005 \end{gathered}$ | $-0.051^{* * *}$ 0.001 $0.1199^{* * *}$ 0.007 -0.112 *** 0.009 0.000 0.000 -0.021 *** 0.004 -0.006 *** 0.001 0.000 0.000 | $\begin{gathered} -0.050 \text { *** } \\ 0.001 \\ 0.1255^{* * *} \\ 0.007^{2} \\ -0.104^{* * *} \\ 0.009 \\ -0.001 * * * \\ 0.000 \\ -0.022^{* * *} \\ 0.004 \\ -0.004 ~ * * * \\ 0.001 \\ 0.000 \\ 0.000 \end{gathered}$ | $\begin{gathered} \hline-0.102 \text { *** } \\ 0.008 \\ -0.322 \text { *** } \\ 0.069 \\ 0.020 \\ 0.042 \\ 0.000 \\ 0.000 \\ -0.152 ~ * * * \\ 0.030 \\ 0.004 \\ 0.004 \\ 0.000 \\ 0.012 \end{gathered}$ |
| Liquidity provisions | Funds Raising <br> Volatility of Liquidity | $\begin{gathered} \hline-0.007 * \\ 0.004 \\ -0.073 \text { ***} \\ 0.012 \end{gathered}$ | $\begin{gathered} \hline-0.009^{* *} \\ 0.004^{* *} \\ -0.0477^{* * *} \\ 0.013 \end{gathered}$ | $\begin{gathered} 0.045^{* *} \\ 0.021 \\ -0.176^{* * *} \\ 0.036 \end{gathered}$ | $\begin{aligned} & \hline-0.054^{* * *} \\ & 0.004 \\ & 0.065^{* * *} \\ & 0.016 \end{aligned}$ | $\begin{aligned} & \hline-0.044^{* * *} \\ & 0.004^{* *} \\ & 0.045^{* * *} \\ & 0.016 \end{aligned}$ | $\begin{aligned} & \hline-0.117^{* * *} \\ & 0.020 \\ & 0.345^{* * *} \\ & 0.055 \end{aligned}$ |
| Liquidity motivations | Total loans <br> Non-domestic assets <br> Total shares | $\begin{gathered} \hline-0.006 \\ 0.003 \\ -0.023 * * \\ 0.011 \\ -0.076 \\ \text { *** } \\ 0.011 \\ \hline \end{gathered}$ | $\begin{gathered} \hline 0.002 \\ 0.003 \\ -0.018 ~ * \\ 0.011 \\ -0.036 \text { *** } \\ 0.012 \end{gathered}$ | $\begin{gathered} 0.120 \text { *** } \\ 0.021 \\ -0.078 \\ 0.052 \\ -0.189 \text { *** } \\ 0.053 \end{gathered}$ | $\begin{gathered} \hline 0.091^{* * *} \\ 0.003 \\ -0.117^{* * *} \\ 0.011 \\ -0.064^{* * *} \\ 0.011 \\ \hline \end{gathered}$ | $\begin{gathered} \hline 0.100^{* * *} \\ 0.004 \\ -0.088^{* * *} \\ 0.011 \\ -0.094^{* * *} \\ 0.012 \\ \hline \end{gathered}$ | $\begin{gathered} 0.000 \\ 0.020 \\ -0.156 \text { *** } \\ 0.042 \\ -0.080 \\ 0.050 \\ \hline \end{gathered}$ |
| borrower and lender |  |  |  |  |  |  |  |
| Duration | Relationship duration | $\begin{aligned} & \hline 0.001 * * * \\ & 0.000 \\ & \hline \end{aligned}$ | $\begin{aligned} & \hline 0.001 \text { *** } \\ & 0.000 \\ & \hline \end{aligned}$ | $\begin{aligned} & 0.000 \text { *** } \\ & 0.000 \\ & \hline \end{aligned}$ | $\begin{aligned} & \hline 0.001 \text { *** } \\ & 0.000 \\ & \hline \end{aligned}$ | $\begin{aligned} & \hline 0.001 * * * \\ & 0.000 \\ & \hline \end{aligned}$ | $\begin{aligned} & \hline 0.001 \text { *** } \\ & 0.000 \\ & \hline \end{aligned}$ |
| Liquidity | Liquidity shocks correlation | $\begin{aligned} & \hline 0.006^{* * *} \\ & 0.001 \\ & \hline \end{aligned}$ | $\begin{aligned} & \hline 0.005^{* * *} \\ & 0.001 \\ & \hline \end{aligned}$ | $\begin{aligned} & \hline 0.007 \text { *** } \\ & 0.002 \\ & \hline \end{aligned}$ | $\begin{aligned} & -0.003^{* * *} \\ & 0.001 \\ & \hline \end{aligned}$ | $\begin{gathered} \hline-0.002^{* * *} \\ 0.001 \\ \hline \end{gathered}$ | $\begin{array}{r} \hline-0.002 \\ 0.002 \\ \hline \end{array}$ |
| Interaction outside the interbank market | Securities Interaction (borrower vs. lender) Securities Interaction (lender vs. borrower) | $\begin{aligned} & 0^{0.016^{* * *}} \\ & 0.001 \\ & 0.005^{* * *} \\ & 0.001 \end{aligned}$ | $\begin{aligned} & \hline 0.007^{* * *} \\ & 0.001 \\ & 0.006^{* * *} \\ & 0.002^{*} \end{aligned}$ | $\begin{aligned} & \hline 0.009 \text { * } \\ & 0.005 \\ & 0.014 \text { *** } \\ & 0.004 \end{aligned}$ | $\begin{aligned} & \hline-0.007^{* * *} \\ & 0.001 \\ & 0.031 \text { *** } \\ & 0.001 \end{aligned}$ | $\begin{gathered} \hline 0.003^{* *} \\ 0.002 \\ 0.034 \text { *** } \\ 0.002 \end{gathered}$ | $\begin{gathered} \hline 0.002 \\ 0.004 \\ -0.008 * * \\ 0.004 \end{gathered}$ |
| Counterpart dummies constant <br> Number of observations R-sq |  | yes $0.2888^{* *}$ 0.122 253,200 0.20 | yes $0.275^{* *}$ 0.117 219,325 0.17 | $\begin{array}{r} \hline \text { yes } \\ -0.240 \\ 0.159 \\ 33,875 \\ 0.16 \end{array}$ | yes $0.484^{* * *}$ 0.133 277,541 0.21 | yes $0.442^{* * *}$ 0.126 232,574 0.12 | yes $0.9622^{* * *}$ 0.161 44,967 0.37 |

Table reports regression coefficients and associated standard errors in italics. ${ }^{* * *}$, ${ }^{* *}$, and ${ }^{*}$ denote statistical significance at 1,5 and $10 \%$ level.

Table 8. Third step: over the crisis - marginal effects


Table displays the percentage change that indexes SLI and SBI undergo passing from the $25^{\text {th }}$ to the $75^{\text {th }}$ distribution percentile of each regressor, before and after the crisis.

Figure 6. Secured interbank loans
(as a share of total interbank domestic inter-group exposures)


Table 9: Allowing for secured interbank loans

|  |  | SLI |  | SBI |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | pre-crisis | post-crisis | pre-crisis | post-crisis |
| borrower |  |  |  |  |  |
| Agency problems | Size <br> Capital <br> Bad loans <br> Structure of income/Opacity <br> Banks without rating (0-1) <br> Rating <br> ROE | $\begin{gathered} -0.031^{* * *} \\ 0.001 \\ 0.238^{* * *} \\ 0.014 \\ 0.0477^{* * *} \\ 0.008 \\ 0.000 \\ 0.000 \\ -0.0599^{* * *} \\ 0.004 \\ -0.001 \\ 0.001 \\ 0.000 \\ 0.000 \end{gathered}$ | $\begin{gathered} -0.053 \text { *** } \\ 0.008 \\ -0.136 \text { * } \\ 0.088 \\ -0.005 \\ 0.047 \\ 0.000 \\ 0.000 \\ 0.025 \\ 0.027 \\ 0.002 * \\ 0.001 \\ -0.027 \text { ** } \\ 0.013 \end{gathered}$ | $\begin{gathered} 0.001 \\ 0.001 \\ -0.021 \\ 0.015 \\ -0.0388^{* *} \\ 0.008 \\ 0.000 \\ 0.000 \\ 0.008 ~ * * \\ 0.004 \\ -0.001 ~ * * \\ 0.001 \\ 0.000 \\ 0.000 \end{gathered}$ | $\begin{gathered} \hline 0.001 \\ 0.007 \\ 0.002 \\ 0.082 \\ -0.102 \text { ** } \\ 0.046 \\ -0.001 * \\ 0.000 \\ 0.006 \\ 0.025 \\ 0.002 \\ 0.003 \\ 0.036 \\ 0.011 \end{gathered}$ |
| Liquidity needs | Fund Raising <br> Volatility of Liquidity | $\begin{gathered} \hline 0.019^{* * *} \\ 0.004^{* *} \\ -0.084^{* * *} \\ 0.011 \\ \hline \end{gathered}$ | $\begin{gathered} 0.248 \text { *** } \\ 0.020 \\ -0.095^{* * *} \\ 0.024 \end{gathered}$ | $\begin{gathered} \hline-0.045^{* * *} \\ 0.004 \\ 0.007 * \\ 0.004 \\ \hline \end{gathered}$ | $\begin{gathered} \hline-0.041 \text { *** } \\ 0.015 \\ 0.025 \\ 0.024 \\ \hline \end{gathered}$ |
| Liquidity motivations | Total loans <br> Non-domestic assets <br> Total shares <br> Intra-group interbank net-position <br> Non-domestic interbank net-position | $0.061^{* * *}$ $0.003^{* *}$ $-0.121^{* * *}$ 0.012 $-0.153^{* * *}$ $0.009^{* * *}$ $-0.035^{* * *}$ 0.002 $-0.027^{* * *}$ 0.001 | $-0.062^{* * *}$ 0.020 $-0.152^{* * *}$ 0.055 $-0.118^{* * *}$ 0.043 $-0.1388^{* * *}$ 0.008 $-0.090^{* * *}$ 0.005 | 0.047 *** 0.004 $0.053^{* *}$ 0.010 -0.007 0.013 $0.009^{* * *}$ 0.002 -0.002 0.002 | -0.009 <br> 0.016 <br> $0.098^{* *}$ <br> 0.038 <br> 0.026 <br> 0.046 <br> $0.0188^{* * *}$ <br> 0.006 <br> $0.027^{* * *}$ <br> 0.004 |
| lender |  |  |  |  |  |
| Lending capacity | Size <br> Capital <br> Bad loans <br> Structure of income/Opacity <br> Banks without rating (0-1) <br> Rating <br> ROE | $\begin{gathered} \hline 0.011^{* * *} \\ 0.001 \\ -0.0599^{* * *} \\ 0.006 \\ 0.031^{* * *} \\ 0.007 \\ 0.001 \text { ** } \\ 0.000 \\ 0.011^{* * *} \\ 0.004 \\ -0.003 ~ * * * \\ 0.001 \\ 0.000 \\ 0.000 \end{gathered}$ | $0.049{ }^{* * *}$ 0.008 $0.099^{*}$ 0.066 $0.198 ~ * * *$ 0.051 $-0.001 ~ * *$ 0.000 -0.076 *** 0.031 $0.011 ~ * * *$ 0.004 -0.001 0.005 | $\begin{gathered} -0.046^{* * *} \\ 0.001 \\ 0.126^{* * *} \\ 0.007 \\ -0.091^{* * *} \\ 0.009 \\ -0.001 ~ * * * \\ 0.000 \\ -0.019 * * * \\ 0.004 \\ -0.005{ }^{* * *} \\ 0.001 \\ 0.000 \\ 0.000 \end{gathered}$ | $-0.1022^{* * *}$ 0.008 $-0.320^{* * *}$ 0.067 0.003 0.041 0.000 0.000 $-0.130{ }^{* * *}$ 0.029 -0.001 0.004 -0.001 0.012 |
| Liquidity provisions | Funds Raising <br> Volatility of Liquidity | $\begin{gathered} -0.009 \text { ** } \\ 0.004 \\ -0.083 \text { *** } \\ 0.012 \end{gathered}$ | $\begin{gathered} 0.035 * \\ 0.020 \\ -0.174 * * * \\ 0.035 \end{gathered}$ | $\begin{aligned} & \hline-0.039^{* * *} \\ & 0.004^{* *} \\ & 0.031^{* *} \\ & 0.015 \end{aligned}$ | $\begin{gathered} -0.128^{* * *} \\ 0.019 \\ 0.326^{* * *} \\ 0.054 \end{gathered}$ |
| Liquidity motivations | Total loans <br> Non-domestic assets <br> Total shares | $\begin{gathered} \hline 0.006 \text { * } \\ 0.003 \\ -0.012 * \\ 0.010 \\ -0.033 \text { *** } \\ 0.011 \end{gathered}$ | $\begin{gathered} \hline 0.115 \text { *** } \\ 0.021 \\ -0.035 \\ 0.050 \\ -0.108^{* * *} \\ 0.051 \end{gathered}$ | $\begin{gathered} 0.096^{* * *} \\ 0.004 \\ -0.099^{* * *} \\ 0.012 \\ -0.077^{* * *} \\ 0.011 \end{gathered}$ | $\begin{gathered} \hline 0.006 \\ 0.020 \\ -0.158 * * * \\ 0.042 \\ -0.062 \\ 0.049 \end{gathered}$ |
| borrower and lender |  |  |  |  |  |
| Duration | Relationship duration | $\begin{aligned} & \hline 0.001^{* * *} \\ & 0.000^{*} \end{aligned}$ | $\begin{aligned} & \hline 0.000^{* * *} \\ & 0.000 \end{aligned}$ | $\begin{aligned} & \hline 0.001 \text { *** } \\ & 0.000 \\ & \hline \end{aligned}$ | $\begin{aligned} & \hline 0.001^{* * *} \\ & 0.000 \\ & \hline \end{aligned}$ |
| Liquidity | Liquidity shocks correlation | $\begin{aligned} & \hline 0.005^{* * *} \\ & 0.001 \\ & \hline \end{aligned}$ | $\begin{aligned} & \hline 0.007 \text { *** } \\ & 0.002 \\ & \hline \end{aligned}$ | $\begin{gathered} -0.002^{* * *} \\ 0.001 \\ \hline \end{gathered}$ | $\begin{array}{r} -0.002 \\ 0.002 \\ \hline \end{array}$ |
| Interaction outside the interbank market | Securities Interaction (borrower vs. lender) <br> Securities Interaction(lender vs. borrower) | $\begin{aligned} & \hline 0.007^{* * *} \\ & 0.001 \\ & 0.006^{* * *} \\ & 0.002^{2} \end{aligned}$ | $\begin{gathered} \hline 0.009{ }^{*} \\ 0.005 \\ 0.0144^{* * *} \\ 0.004 \end{gathered}$ | $\begin{aligned} & \hline 0.003^{* *} \\ & 0.002 \\ & 0.034^{* * *} \\ & 0.002 \end{aligned}$ | $\begin{gathered} \hline 0.002 \\ 0.004 \\ -0.008 \text { ** } \\ 0.004 \end{gathered}$ |
| Garantees | Secured / unsecured interbank loans | $\begin{aligned} & \hline 0.809^{* * *} \\ & 0.006 \end{aligned}$ | $\begin{aligned} & 0.609^{* * *} \\ & 0.013 \end{aligned}$ | $\begin{aligned} & 0.731 \text { *** } \\ & 0.005 \end{aligned}$ | $\begin{aligned} & 0.742 \text { *** } \\ & 0.017 \end{aligned}$ |
| Counterpart dummies constant <br> Number of observations R-sq |  | yes 0.226 ** 0.015 219,325 0.23 | $\begin{array}{r} \hline \text { yes } \\ -0.170 \\ 0.111 \\ 33,875 \\ 0.21 \end{array}$ | yes $0.4311^{* * *}$ 0.120 232,574 0.20 | yes $1.0122^{* * *}$ 0.158 44,967 0.40 |

Table reports regression coefficients and associated standard errors in italics. ${ }^{* * *}$, **, and $*$ denote statistical significance at 1,5 and $10 \%$ level.

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    ${ }^{2}$ See Lummer and McConnell (1989); Diamond (1991); Rajan (1992); Berglöf and von Thadden (1994); Boot and Thakor (1994); Petersen and Rajan (1995); Berlin and Mester (1999); Boot (2000).

[^2]:    ${ }^{3}$ See Dudley (2008); Cassola et al. (2008); Gynetelberg and Wooldridge (2008); Michaud and Upper (2008); Angelini et al. (2011); Taylor and Williams (2009); Heider et al. (2009); Porzio et al. (2009); Afonso et al. (2010).

[^3]:    ${ }^{4}$ Relationships which began prior to my sample period are left-censored; relationships continuing after my sampleperiod are right-censored. Different methods exist to allow for left- and right- censoring. I use them as robustness checks in Section 5.

[^4]:    ${ }^{5} \mathrm{I}$ also use other baseline hazard functions as robustness checks. See Section 5.

[^5]:    ${ }^{6}$ Thus, I calculate the relationship between $i$ and $j$ as one to the number of banks that $i$ lent to (or borrowed from) during each period. My indexes are similar to those computed by Furfine (2001); Cocco et al. (2009); and in general to those extensively utilized in the literature on bank-firm customer relationships (e.g. Elsas, 2005).

[^6]:    ${ }^{7}$ There is a second - not less relevant - reason why my approach works well even in the case of point (iv). For completeness on this issue, it is useful to deal with this second reason here, even if I have not yet described my estimations in detail. The case of point (iv) represents a (potential) measurement error. The only possible effect of this error would be to underestimate the length of span $T_{s}$. However, since in my estimations I find that relationships are long and stable, my outcomes would have been even stronger without this error. Furthermore, I also checked this issue empirically in my regressions, adding a dummy variable for bank mergers. The dummy had no impact on the likelihood of terminating an interbank relationship or on the other regressors.

[^7]:    ${ }^{8}$ Estimations of the three steps of my analysis are carried out using banks' previous-quarter balance sheet items to resolve possible endogeneity problems and to replicate the publication delay needed for banks to assess one another.
    ${ }^{9}$ As a robustness check, Relationship Duration is computed in three alternative ways. First, in the basic estimations, it counts in each period the integer number of consecutive months elapsed in my sample since the start of an interbank relationship between each pair of banks. Equivalently to $T_{s}$, the counting starts over whenever a relationship resumes after a break of any length, even one month. Second, to control for the size of the exposures, I recalculated the variable removing the smallest relationships, i.e. those below either the $10^{\text {th }}$ or $25^{\text {th }}$ distribution percentile of SBI and SLI. Third, to control for the effective period of activity of each bank, I computed the variable as a ratio between the number of consecutive months and the total number of months in which the bank is active in the interbank market, such that the variable continues to assume increasing values but weighted for the effective period of activity. In the first definition of the variable, the values and number of observations of Relationship Duration and the spans $T_{s}$ are partially different (Tables 1-3). This is because $T_{s}$ excludes one-period relationships, while Relationship Duration counts them as lasting one month.
    ${ }^{10}$ As detailed in Section 4, the signs of coefficients have an opposite interpretation in my first and second steps of analysis. In particular, in a partially counterintuitive way, the hazard rate estimation predicts that negative coefficients of covariates indicate a longer duration. In this section, I comment on the expected signs in the "intuitive" way.

[^8]:    ${ }^{11}$ "Size" is particularly interesting in this field of research because of the classical "too big to fail" argument, according to which its effect should be positive as larger banks are more likely to obtain interbank loans because they should not go bankrupt. Moreover, larger firms are typically considered less opaque and thus more creditworthy. On the other hand, the effect might be the opposite because: (i) at least in the wake of the financial turmoil, the Lehman Brothers' failure could have reversed the traditional "too big to fail" argument or made it harder to determine who is "too big"; (ii) larger banks might demand less interbank funding, as they can count upon other sources. The name "Structure of Income/Opacity" derives from the fact that this variable is often used as a proxy of asymmetric information because fee-generating activities are considered less easy to read by other agents compared to interest-generating activities.
    ${ }^{12}$ Angelini et al. (2011) find that Fitch ratings are more informative in the assessment of banks and financial firms. All the credit ratings are obtained as a monthly average of ratings available daily. My first choice is the overall individual rating; the other three types of credit rating are: support, long-term and short-term issuer default rating. Again following Angelini et al. (2011), I assign the rating of the controlling company to banks that do not have their own rating but belong to groups with rated banks. However, as a check I remove this hypothesis.

[^9]:    ${ }^{13}$ Besides permitting the estimation of the determinants of duration, the inclusion of regressors serves to control for heterogeneity across observations, and according to Heckman and Singer (1984) and Ongena and Smith (2001) it eliminates possible biases in the outcomes of the parameter $\varphi$. In this light, I also ran regressions with and without a time dummy to allow for macroeconomic trends and in particular for the monetary policy stance (Affinito and Farabullini, 2009).

[^10]:    ${ }^{14}$ As mentioned, in the second step I use panel estimation as a basic model. It is worthwhile clarifying four aspects. First, I ran both fixed effects and random effects models. Results remained stable, in part because my $T$ is large enough. I present results of the fixed effects because the individual effects and the explanatory variables are likely to be correlated, as signalled by the Hausman test. Second, I attempted to cluster both at the borrower and at the lender level. In the specifications displayed, the fixed effects capture the borrowers in the SBI and the lenders in the SLI, as they are the object of the selection process in each respective equation. However, results were stable after switching the individual effects, because I added counterparty dummies consistently with the relevant literature and in line with the presence of the counterparty's characteristics among regressors. Third, as in the first step, I ran regressions with and without a time dummy. Fourth, I adopted the fixed effects adjusting the standard errors for general forms of heteroskedasticity and autocorrelation (Arellano, 1987).
    ${ }^{15}$ Very few regressors appear less stable: 5 out of 68 total regressors. In Section 5, I discuss the reasons of this minor stability. Coherently with the first step, I also ran regressions including as regressors the numbers of counterparties. Although the results were confirmed, I decided not to use those estimations in the second step because (i) my dependent variables already discount the number of counterparties; and (ii) the inverses of the number of counterparties are used as alternative dependent variables in unreported but consistent estimations.
    ${ }^{16}$ The different effect determined by the same variables in the asset and in the liability side is typical of the literature on interbank markets. The use of the same regressors in the estimations of the two indexes allows me to detect some interesting, sometimes uneven and sometimes mirrored, results. For example, the variable Size presents uneven results. In the SLI, substantial lenders of small borrowers tend to be large banks (the signs of variable Size are negative for

[^11]:    borrowers and positive for lenders). In the SBI, substantial borrowers of small lenders tend to be large banks. This result is typical and is also due to the fact that larger banks weight more on the balance sheets of their counterparties. An example of mirrored result is represented by the variable Bad Loans. When substantial lenders have high Bad Loans, so have borrowers (SLI estimation); when the value of the ratio is small, it is small for both of them (SBI).
    ${ }^{17}$ The outcomes of the two borrower variables linked to rating agencies are described in the next sub-section because the results of these two variables seem to depend on a different attitude of banks before and after the financial crisis.

[^12]:    ${ }^{18}$ On the other hand, in the SLI both regressors are negative. This means that, when a bank is a net lender inside a domestic group or abroad, it does not select one particular lender because it is likely to request funds from many banks.
    ${ }^{19}$ Interestingly, however, the sign is negative in the SBI for securities held by borrowers and issued by lenders. This seems to corroborate the idea that substantial borrowers do not choose their lenders but are chosen by them.

[^13]:    ${ }^{20}$ In fact, although dispersedly, I have already noted that my outcomes are robust to the following checks: (i) the inclusion of a dummy variable assuming value one when a bank merger occurs, in order to control for relationships terminated because of a merger; (ii) the estimation of $\varphi$ removing the small relationships, i.e. those under the $10^{\text {th }}, 25^{\text {th }}$ and $50^{\text {th }}$ percentile of SBI and SLI; (iii) the alternative measure of SBI and SLI based on the number of interbank relationships rather than quantities transacted; (iv) the two alternative computations of the variable Relationship Duration (the former obtained removing the smallest exposures; the latter calculated as a ratio between the number of consecutive months and the total number of operating months of each bank); (v) the adoption of fixed and random effects in the second and third step; (vi) clustering at borrower and lender level; (vii) the inclusion of a time dummy; (viii) the use of the other three types of credit ratings taken by Fitch; (ix) removal of the hypothesis that the same rating applies to unrated banks of the same group.
    ${ }^{21}$ Since results always remained very similar to those reported in Tables 5-8, for brevity, I limit the use of additional tables, but, all the robustness checks are available from the author upon request.

[^14]:    ${ }^{22}$ In particular, although they were expected to be more subject to endogeneity problems, the results were always confirmed for the following variables: Relationship Duration; Liquidity Shocks Correlation; Securities Interaction; borrowers' Rating; Intra-group and Non-Domestic Net Interbank Position.

[^15]:    ${ }^{23}$ Furthermore, since the Bank of Italy's new prudential supervisory reports went into effect as of December 2008, and this could have produced some discontinuities in my time-series, I repeated all estimations by dropping the last few periods.

[^16]:    ${ }^{24}$ Another way of taking account of securitized loans was to add them to the other loans (the same methodology is used in Albertazzi and Marchetti 2010 and De Mitri et al., 2010) in two of my regressors: Bad Loans and Total Loans. In fact, because of securitizations, outstanding loans could decrease without an actual reduction in credit granted. However, the results of my two variables related to loans remained unmodified after this check.
    ${ }^{25}$ Actually, if this had been the case, then my variable Relationship Duration should have become insignificant, while it remains statistically and economically significant (on my entire sample period, before the crisis, and after the crisis). Nonetheless, allowing for collateralized exposures is useful, because otherwise (although interbank customer relationships continued to exist and banks continued to privilege counterparties with a pre-existing relationship) one might conjecture that, after the onset of the crisis, lending banks started to ask for collateral even from their usual counterparties; or it might even be conjectured that interbank customer relationships survived only thanks to an increase in collateral.
    ${ }^{26}$ For example, an increase in collateral could explain the pronounced irrelevance of rating agencies and borrowers' credit scores after the crisis.
    ${ }^{27}$ The secured exposures are interbank repos, which are secured by definition.

[^17]:    ${ }^{28}$ In the first step, in particular, $\varphi$ was always less than 1 . In the second and third steps, the branches of foreign banks did not modify the results, and the only effect of removing the cooperative banks was to make some variables insignificant.

[^18]:    (*) Requests for copies should be sent to:
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