

WORKING paper



Illiquid Collateral and Bank Lending during the European Sovereign Debt Crisis

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ABSTRACT

We assess the effect of accepting illiquid assets as collateral at the central bank on banks' lending activity. We study the lending activity of the 177 largest banks in the Euro area between 2011m1 and 2014m12 and the composition of their pool of collateral pledged with the Eurosystem. Panel regression estimates show that the banks that pledged more illiquid collateral with the Eurosystem increased their lending to non-financial firms and households: a one standard deviation increase in the volume of illiquid collateral increase lending by 0.6%.⁴

Keywords: collateral, loans, central bank, euro crisis

JEL classification: E52 E58 G01 G21

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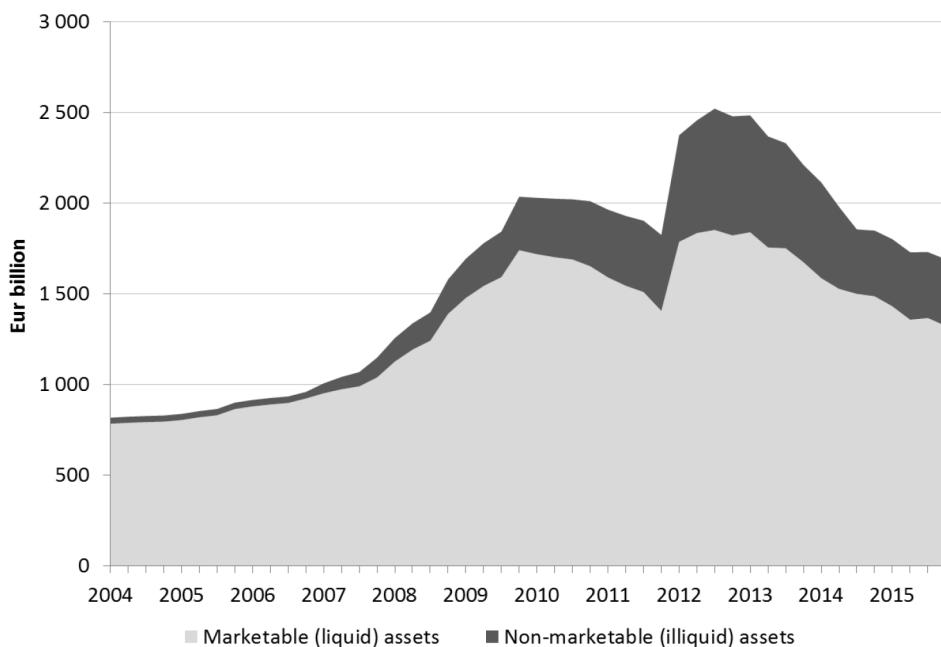
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NON-TECHNICAL SUMMARY

This paper studies the lending of last resort function of the Eurosystem in a time of bank funding stress, in relation to its underlying collateral policy. We show that the current collateral policy of the Eurosystem that allows banks to pledge credit claims of good quality as collateral, boosted lending activity for both banks that did and did not suffer a bank run during the euro debt crisis.

The collateral framework of the Eurosystem is topical as central bank money is issued through temporary loans of reserves against collateral. The assets eligible as collateral comprise two categories: marketable assets which are traded in organized markets and non-marketable assets which consist mostly of credit claims such as mortgages and loans to non-financial companies of sufficiently low credit risk. Figure below plots the relative importance of the latter in the collateral pledged with the Eurosystem from 2004 to 2015.

Collateral pledged with the Eurosystem since 2004
Market value after haircut, EUR bn



Source: authors' computations using Eurosystem data on collateral.

We show that the acceptability of credit claim as collateral has a positive impact on bank lending to non-financial agents during the euro area sovereign debt crisis. We use the sovereign debt crisis in the euro area to identify a wholesale funding stress on banks that increased the demand for central banks reserves and put pressure on collateral availability. We document a sharp reduction in euro-denominated wholesale funding, which was apparent in the reduction of the activity in the euro area interbank market. This period is also characterized by the reduction of the market value of some European government bonds –which are the main source of marketable assets. Finally, securitization –which can be used by banks to convert illiquid loans into more liquid asset-backed securities and covered bank bonds – was of little help during this period as the securitization activity was already small before 2007, and shrank further in the wake of the subprime crisis. The acceptance of illiquid collateral by the Eurosystem could thus have helped banks to sustain their lending activity.

We exploit three bank-level datasets at a monthly frequency with information on all refinancing operations with the Eurosystem, the composition of the pool of collateral pledged by each bank and the evolution of their balance sheets. The database contains information on the 177 largest euro area banks at monthly frequency between January 2011 and December 2014.

We estimate panel regressions in which we explain the lending activity to non-financial corporations and households by the intensity of the bank run and by the total volume of collateral and the volume of illiquid collateral pledged. We crucially control for banks' specificities (capital ratio, ratings and bank fixed effects) and for common fluctuations of loans at the country level.

Our main result is that an increase in the share of illiquid assets pledged was associated with greater resilience of lending activity. More concretely, a one standard deviation increase in the volume of illiquid collateral pledged with the Eurosystem corresponded to a 0.6% increase in loans to the economy. This effect was due equally to a quantitative effect of collateral –an increase in the outstanding volume of collateral increased the supply of loans– and a composition effect –a shift from liquid to illiquid collateral was associated with an increase in loans for a given volume of collateral pledged with the central bank. This result, which also holds for banks that were run, shows the importance of the collateral framework for the transmission of monetary policy, as the non-financial agents of the euro area rely mostly on bank lending to fund their regular activities.

Liquidité du collatéral et prêts à l'économie pendant la crise de la zone euro

RÉSUMÉ

L'article évalue l'impact positif de l'acceptation en collatéral d'actifs illiquides par la banque centrale sur les prêts à l'économie des 177 plus grandes banques de la zone euro entre janvier 2011 et décembre 2014. Les estimations des régressions de panel montrent que l'impact est économiquement significatif: une augmentation d'un écart type du volume de collatéraux illiquides mis en garantie des opérations de l'Eurosystème est associée à une augmentation de 0.6 % des prêts à l'économie par les banques.

Mots-clés : cadre de garantie de l'Eurosystème, prêts à l'économie, crise de la zone euro

Les Documents de travail reflètent les idées personnelles de leurs auteurs et n'expriment pas nécessairement la position de la Banque de France.
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Illiquid Collateral and Bank Lending during the European Sovereign Debt Crisis*

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Abstract

This paper assesses the effect on banks' lending activity of accepting illiquid collateral at the central bank refinancing facility in times of wholesale funding stress. We exploit original data on the loans granted by the 177 largest euro area banks between 2011m1 and 2014m12 and on the composition of their pool of collateral pledged with the Eurosystem. During this period, two-thirds of the banks in our sample experienced a sizable loss of wholesale funding. Panel regression estimates show that the banks that pledged more illiquid collateral with the Eurosystem reduced their lending to non-financial firms and households less: a one standard deviation increase in the volume of illiquid collateral pledged corresponded to a 0.6% increase in loans to the economy. This result holds for banks that were and were not run. Our finding thus suggests that the broad range of collateral eligible in the euro area may have helped to mitigate the credit crunch during the euro debt crisis.

J.E.L.: E52 E58 G01 G21

Keywords: collateral, loans, central bank, euro crisis.

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1 Introduction

Banks extract profits from maturity and liquidity mismatches in their balance sheet: they fund long-term and illiquid claims on the asset side (e.g. loans), with shorter-term and more liquid debt on the liability side (e.g. interbank deposits) – see Kashyap et al. (2000) and Gorton and Winton (2003) for a survey. They face a risk that these resources are withdrawn before their asset side matures, which threatens their liquidity position (see Bryant (1980) and Diamond and Dybvig (1983) for models of that risk). This situation is often referred to as a bank run, which can evolve into a credit crunch. The banking sector shrinks and eventually contracts its supply of loans to the economy.

To mitigate a run, banks may have recourse to the lender of last resort, replacing market funding by reserves borrowed from the central bank. This role of mitigating the real adverse consequences of illiquidity is a core function of central banks. These operations of lending of last resort are conducted against collateral, which means banks have to pledge eligible assets to protect the central bank from counterparty risk. The range of eligible collateral varies considerably across time and central banks, and the Eurosystem¹ accepts one of the broadest set of assets as collateral for its refinancing operations, from government bonds to credit claims. While the operational framework certainly remains secondary in normal times, the recent crisis has highlighted the importance of the modalities of central bank refinancing.

We use the sovereign debt crisis in the euro area to identify the impact of the central bank collateral framework on the economy, and in particular the ability to pledge relatively more illiquid assets as collateral. First, the period is characterized by a sharp reduction in money market funding, resulting in part from the reduction of the dollar funding of European banks by U.S. money market mutual funds (see Correa et al., 2013 and Ivashina et al., 2015). As we document in this paper, this run was also accompanied by a sharp reduction in euro-denominated wholesale funding, which was apparent in the reduction of the activity in the euro area interbank market. Second, macroeconomic risk and the anticipation that some countries might exit the euro area reduced the market value of some European government bonds, which are the main source of liquid marketable assets in the euro area. Third, securitization – which can be used by banks to convert illiquid loans into more liquid asset-backed securities and covered bank bonds – was of little help during this period: the securitization activity was already small before 2007, and

¹ The Eurosystem is composed of the European Central Bank (ECB) and the national central banks that implement monetary policy.

shrank further in the wake of the subprime crisis. All in all, wholesale funding stress increased the demand for central banks reserves and put pressure on collateral availability. The acceptance of illiquid collateral by the Eurosystem could thus have helped banks to sustain their lending activity or reduced the incentive to cut lending to the economy.

This paper studies the lending of last resort function of the Eurosystem in a time of bank funding stress, in relation to its underlying collateral policy. We show that the current collateral policy of the Eurosystem that allows banks to pledge credit claims of good quality as collateral boosted lending activity for banks that suffered and did not suffer a bank run during the euro debt crisis.²

To show this result, we exploit three bank-level datasets at a monthly frequency. The first dataset reports all refinancing operations with the Eurosystem. The second dataset details the pool of collateral pledged by each bank as a guarantee for these refinancing operations. The third dataset reports the evolution of euro area banks' balance sheets. The final database consists of information on the 177 largest euro area banks at monthly frequency between January 2011 and December 2014. We construct a measure of interbank funding loss, and define a run variable at the bank level. For each bank, we also compute the volume of illiquid assets pledged with the Eurosystem as a share of its balance sheet. We interpret this share as a measure of a bank's ability to liquefy the most illiquid part of its balance sheet.

We estimate panel regressions in which the dependent variable is the lending activity to non-financial corporations and households, scaled by balance sheet size over the 2011-2014 period. We explain this variable by the intensity of the run that affected the bank, and by the total volume of collateral and the volume of illiquid collateral pledged. We crucially control for banks' specificities (capital ratio, ratings and bank fixed effects) and for common fluctuations of loans at the country level.

Our main result is that an increase in the share of illiquid assets pledged was associated with greater resilience of lending activity. More concretely, a one standard deviation increase in the volume of illiquid collateral pledged with the Eurosystem corresponded to a 0.6% increase in loans to the economy. This effect was due equally to a quantitative effect of collateral –an increase in the outstanding volume of collateral increased the supply of loans– and a composition effect –a shift from liquid to illiquid collateral was

² In the rest of the paper, unless specified, we use non-marketable assets, credit claims, illiquid assets or loans interchangeably to describe the loan portfolio of a bank that is pledged or pledgeable as collateral with the central bank.

associated with an increase in loans for a given volume of collateral pledged with the central bank. This result, which also holds for banks that were run, is important as the transmission of monetary policy in the euro area relies mostly on bank lending, which represents an overwhelming share of non-financial firms' financing.

Our result also suggests that bank runs were associated with a reduction in loans. A one standard deviation increase in the intensity of the run led to a 0.5% drop in the loan supply. This drop was smaller for banks with a higher volume of collateral, irrespective of its liquidity class. Finally, we find that an increase in the equity ratio was associated with more loans.

Our paper is related to four parts of the literature. First, we investigate the impact of the degree of liquidity of the assets held by banks on the implementation of monetary policy. Kashyap and Stein (2000) have shown that banks holding less liquid assets tend to reduce their lending to the economy more when hit by an adverse funding shock (which they identify as an increase in the interest rate). This paper shows that the more illiquid the collateral banks can pledge, the more resilient to bank runs lending activity is. Second, we contribute to the literature on the real effect of bank runs and the instruments banks can use to mitigate them, notably through the lender of last resort (see Diamond and Dybvig, 1983; Diamond and Rajan, 2005). Third, we contribute to the empirical literature dealing with the type of collateral that a central bank must accept (Bindseil and Papadia, 2006; Bignon and Jobst, 2017). We emphasize the importance of the ability to pledge good quality but illiquid collateral. Fourth, we provide empirical evidence to support the theoretical argument according to which the central bank has a (very) long horizon because of its monopoly on the creation of reserves and banknotes. This allows the central bank to hold assets that the market would not be ready to hold, as argued by Bindseil (2014), Bindseil and Jablecki (2013) and Bindseil (2013).

The rest of the paper is structured as follows. Section 2 describes the collateral framework of the Eurosystem of central banks. Section 3 presents the data. Section 4 discusses the empirical evidence on the runs on euro area banks and adds further evidence on the quantitative importance of the loss of wholesale market funding by European banks for the period between 2011 and 2014. Section 5 presents the main specification and our main results on the relation between collateral liquidity and the supply of bank loans. Section 6 concludes.

2 Eurosystem refinancing operations and collateral framework

The Eurosystem issues central bank money and refinances the euro area banking system through regular “open market operations” (see Bindseil, 2014). They take the form of temporary loans of reserves against collateral. All credit institutions, defined as financial intermediaries that receive deposits and grant loans, are eligible if they fulfill the Basel capital ratio. The Treaty on the Functioning of the European Union forbids the Eurosystem to discriminate against counterparties on the basis of their quality or business model.

The maturity of refinancing operations ranges from one week to four years.³ To insure against counterparty default risk, the Eurosystem requires each borrower to pledge collateral. Since October 2008, the Eurosystem has lent to credit institutions at a fixed interest rate and satisfies all bids submitted by banks. With this policy of fixed rate full allotment and given the low interest rates, the only relevant upper bound on the issuance of reserves is the total value of banks' eligible collateral. Among central banks, the Eurosystem accepts one of the broadest range of assets as collateral (see ECB, 2013 and BIS, 2013). The set of eligible assets is larger than the set of collateral eligible with central clearing counterparties, the main operators of the private interbank market.⁴ As a general rule, no asset with a default probability greater than 0.4% at a one-year horizon is eligible as collateral with the Eurosystem. Some securities are permanently accepted (“General framework”), while some other securities are accepted only temporarily (“Temporary framework”), as part of the measures taken by the Eurosystem to cope with the financial crises. The temporary list includes assets that have a default probability greater than 0.4% but lower than 1.5% at a one-year horizon. A single list of all the securities eligible as collateral for the whole of the euro area is published on the ECB's and national central banks' websites. The collateral is pledged at the desk of one of the national central banks. Although this makes a refinancing operation resemble a repurchase agreements (repo), it is more accurate to describe it as a collateralized loan, as the assets pledged are –apart from a few exceptions– generally not earmarked to a specific operation.⁵ The assets are rather deposited in a pool to secure any of the potential operations of the bank with the Eurosystem. It is also noteworthy that ownership of the assets is transferred to the Eurosystem only in case of default.

³ Before 2008, regular operations were conducted every week and every month; their maturity was progressively extended with the unfolding of the crisis events to 3, 6, 12, 36 and finally 48 months and designated as longer-term refinancing operations (LTROs).

⁴ For example, Eurex CCP accepts a list of 11,000 eligible marketable securities –see Mancini et al. (2015)– while the Eurosystem's single list of collateral comprises about 40,000 different marketable securities.

⁵ The Banco de España still authorizes earmarking as an option (see Tamura and Tabakis, 2013)

The collateral framework of eligible assets comprises two categories: marketable assets –assets that are traded in organized markets– and non-marketable assets –mostly credit claims such as mortgages and loans to non-financial companies of sufficiently low credit risk.

The marketable collateral consists of a set of between 35,000 to 45,000 unique securities identified by their International Securities Identification Number (ISIN). Eligible securities are classified into one of the five following categories. The first category consists of the most liquid assets: euro area government bonds, quasi-central banks reserves, i.e. fixed-term deposits (deposits of banks at the ECB, due to the early sterilization of the Securities Markets Programme) and cash. The second category comprises the bonds issued by supranational, public agencies, local and regional government, and “Jumbo” covered bonds with an outstanding amount greater than EUR 1 billion. The third category comprises covered bank bonds and corporate bonds, while the fourth consists of unsecured bank bonds. The fifth category comprises asset-backed securities. Any security must have a minimal rating of BBB– and must be issued in the European Economic Area.

The non-marketable collateral mainly comprises loans, referred as credit claims (CC). Credit claims have been accepted as collateral by the Eurosystem since the introduction of the single list of collateral in 2007, which includes them in the general framework. A credit claim is eligible if it has a fixed and unconditional principal amount and if its interest rate is such that it prevents the occurrence of any negative cash flows (Tamura and Tabakis (2013)). It is also required that the default probability of the loan is estimated to be lower than or equal to 0.4% in the Basel definition of default probability. Only credit claims issued by euro area debtors are eligible.

The acceptance of a credit claim as collateral depends on the regulation defined at the euro area member state level, notably depending on the obligation or not to notify the debtor of the mobilization of its loan in the collateral pool (Sauerzopf, 2007). It also depends on the existence of a minimum threshold amount.⁶ In December 2011, the ECB's Governing Council allowed national central banks to temporarily accept loans with the same characteristics as the loans acceptable in the General Framework but with a default probability between 0.4% and 1.5% (Bignon et al., 2016). This temporary extension is known as the “Additional credit claims” measure (ACC hereafter). Eight national central

⁶ EUR 500,000 is the minimum threshold for cross-border loans, while the minimum amount is at the discretion of each national central bank for other loans.

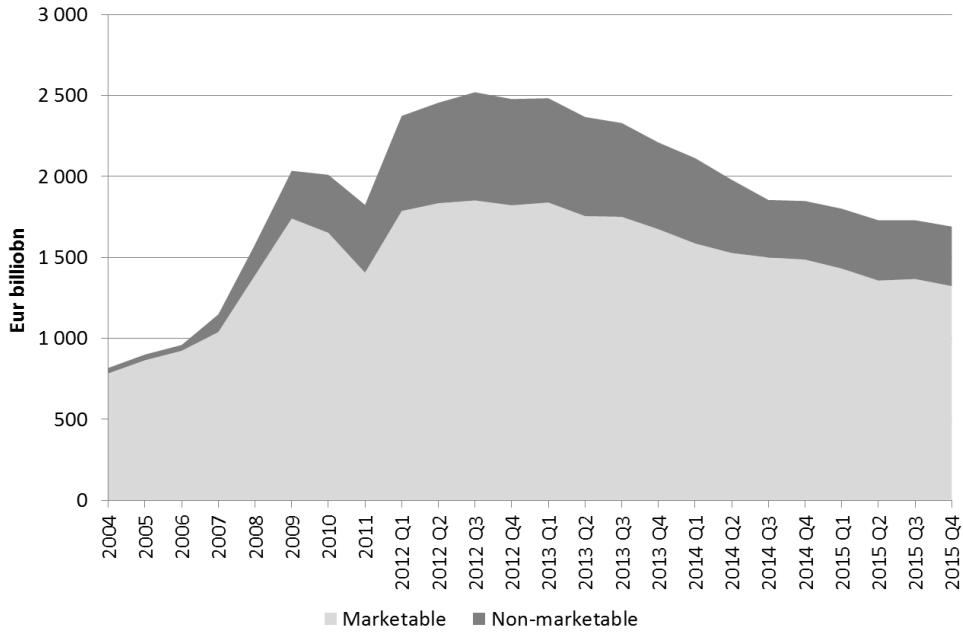
banks participate in this programme (see ECB, 2012). Credit claims and additional credit claims (in value terms after haircut) amounted to a maximum of 27% of the total value after haircut of the collateral pool in 2012q4 (see Figure I).

As long as there is a reliable market price, collateral is priced at market value, but in some cases –e.g. asset-backed securities – the Eurosystem operates its own model-based pricing capabilities (the “Common Eurosystem Pricing Hub”). Credit claims are valued at residual outstanding amount. A haircut is deduced from the market or model value or from the outstanding amount. As a general rule, the haircut is asset-specific and does not depend on a counterparty. It varies with the credit risk associated with the securities, as measured with the principle of first best rating (second best rating for ABS). Ratings can be taken from one or more authorized rating agencies and in some cases from ICAS (the Internal Credit Assessment System).⁷ The haircut also varies with the residual maturity of the asset (typically, the longer the residual maturity, the higher the haircut), with the liquidity risk (typically, the more illiquid the security is, the higher the haircut) and with coupon type. Table 3 in Appendix details the valuation haircut grid used by the Eurosystem in the case of credit claims. By way of illustration, the haircut of certain credit claims can be as high as 65%. The sum of all after-haircut value of the assets pledged by a counterparty defines the maximum amount of borrowing for a given bank with the Eurosystem. It is noteworthy that on aggregate, there is no evidence of collateral scarcity during the period under study. The total outstanding amount of the eligible marketable securities (valued at market prices) increased from EUR 11 to 14 trillion from 2008 to 2014. This is more than ten times larger than the maximum of EUR 1 trillion in refinancing borrowed by banks.

However, the collateral constraint –defined as the ratio of the reserves borrowed to the value of the pool of collateral after haircuts– may have been binding at the bank level. In June 2012, at the onset of the crisis, 11% of the banks in our database had a utilization rate of their collateral pool greater than 90%, while 20% had a utilization rate greater than 80%. These levels are especially high if one remembers that the collateral pool is also used in intraday Target 2 transactions (the Eurosystem payment system). A bank can thus be collateral-constrained for its refinancing operations well below the 100% threshold. Moreover, eligibility criteria may matter even for banks that are over-collateralized. The eligibility of certain assets as collateral is likely to impact their relative degree of liquidity compared with non-eligible assets and hence to alter the incentive to hold them.

⁷ See for instance: <https://www.ecb.europa.eu/paym/coll/risk/ecaf/html/index.en.html>

Figure I: Collateral pledged with the Eurosystem since 2004
Market value after haircut, EUR bn



Coverage: All banks that have maintained a collateral pool with one central bank of the Eurosystem
Source: authors computation using Eurosystem data on collateral pledged with the Eurosystem by the euro-area banking system.

3 Data

We construct and merge three databases at the bank level. The first database reports the evolution of banks' balance sheets. The second provides the composition of the collateral pool pledged by each bank with the Eurosystem. The third gives the volume of refinancing operations of each bank with the Eurosystem.

Table 1: Banks' balance sheets in the IBSI database

Assets	Liabilities
Loans to households (HH)	Capital and reserves
Loans to non-financial corporations (NFCs)	Debt
Loans to monetary and financial institutions (MFIs)	Deposits HH
Loans to government	Deposits NFC
Bonds	Deposits MFI
Stocks	
External assets	External Liabilities

Presentation of the databases. The first database is the Individual Balance Sheet Items dataset (IBSI), which has data on the balance sheets of the 255 biggest banks in the euro area since 2007 at a monthly frequency. It is compiled by the ECB and national

central banks, and is made available to Eurosystem researchers on a confidential basis. The sample of reporting banks has been chosen to include the 150 largest euro area banks by total assets, to reflect the representativeness of the euro area countries' banking systems and to reflect banks' participation in refinancing operations and the diversity of their business models. The banks in the IBSI dataset account for almost 70% of both the total main assets of the euro area banking sector and the total credit supply to euro area residents, as shown in Table 2.

Table 2: Coverage of IBSI sample, as of end-2014m12

	EA	IBSI sample	Final sample	Coverage (Final/EA)
Number of MFIs		255	171	
Total assets (Eur bn)	27,82	19,010	15,084	54 %
Total loans (Eur bn)	17,09	11,789	9,175	54 %

Source: ECB IBSI monthly report

We clean the database for mergers and acquisitions. To this end, we first search for large abnormal changes in the size of banks' balance sheets. When we are unable to find any meaningful explanation for this change using publicly available information, we drop the bank. When this abnormal change corresponds to the month of a bank merger or acquisition, we split the series into two parts to build a pre-merger and a post-merger series. We choose to clearly identify a merger to allow the new and the old entities to display possibly different characteristics. We also drop banks that do not lend to households or non-financial corporations, and exclude banks that never borrow either in the interbank market or from the Eurosystem, i.e. banks that are unconcerned about posting collateral.⁸ In the end, our final database consists of 177 banks. This is equivalent to the number of banks included in other papers using IBSI data – see for instance de Haan et al. (2015). The 177 banks represent half of the banking activity of the euro area (see Table 2).

The second database provides the composition of the collateral pool pledged by banks with one of the Eurosystem national central banks from January 2011 to December 2014. This proprietary database is typically used for operational purposes in the implementation of monetary policy refinancing operations. On average, 1,650 banks have maintained a collateral pool with the Eurosystem, with a minimum of 500 banks and a maximum number of 1,850 banks. The dataset comprises the composition of each pool at the security or loan level. The database comprises 8,174,320 observations of pledged credit claims, i.e. an average of 50,603 loans per bank and month. We use this database to

⁸ This feature is rare and signals a specific business model that is not comparable to other banks.

extract information at the monthly frequency on the total value of the collateral pool after haircut and on the total value after haircut of credit claims pledged by each bank.

The third proprietary database reports each refinancing operation made by individual banks with the Eurosystem, from the 1-week horizon in the context of the Main Refinancing Operations (MROs) to the Long-Term Refinancing Operations (LTROs and VLTROs), which have a 1-month to 4-year horizon. We construct a monthly series of the stock of refinancing of each bank, taking into account that some of these operations were repaid early. On average, 524 banks participated in the refinancing operations, with a minimum of 144 banks and a maximum of 997 banks.

Merging these three databases gives a population of 177 banks at the monthly frequency between January 2011 and December 2014. One bank is missing during one month, so regressions are run with 8,221 observations instead of 8,222.

Construction of the variables. We construct the following variables. First, we construct the stock of loans to the economy as a share of the total bank balance sheet one period before. We label this variable “Loans”. It includes both loans to households and to non-financial corporations, but we exclude loans to other banks to avoid capturing a feedback loop between banks. The latter is reported under the “Interbank lending” heading.

Then, we construct the share of illiquid collateral pledged by each bank with the Eurosystem by computing the ratio of the value after haircut of all credit claims pledged with the Eurosystem scaled by the size of the bank balance sheet one period ahead. For each bank, we use the end-of- month value of credit claims and additional credit claims. We label this variable “Illiq. collat”. Similarly, we compute “Liq. collat”, the share of liquid collateral, defined as government and corporate bonds. The sum of these two ratios is “Tot. collat”.

Finally, we construct a measure of the reliance of each bank on wholesale funding by subtracting the stock of loans borrowed by the bank from the Eurosystem by extracting the value of “MFI Deposits” on the liability side of a bank's balance sheet. Because the refinancing of the Eurosystem is recorded under this heading, we use the stock of the bank's refinancing with the Eurosystem to construct a measure of interbank funding net of central bank refinancing. The volume of wholesale funding external to the euro area is measured by the monthly value of “External Liabilities” and notably records borrowing from U.S. money market mutual funds. By adding these two items, we obtain a measure

of gross wholesale funding for each bank. In the rest of the paper, we label this variable – with a slight abuse of language – “Interbank borrowing”. We use gross wholesale funding to construct a measure of the bank run that we define in the next section. Finally, we also measure net exposure to wholesale funding by subtracting the amount of interbank lending on the asset side of the bank's balance sheet to obtain the “Net interbank position”.

4 Bank financing and the run on European banks

Banks are traditionally reliant on short-term funding sources such as interbank loans or money market mutual funds deposits.⁹ Market funding can be either unsecured or secured with collateral (repos), but the unsecured segment almost disappeared in the euro area with the subprime crisis in 2007.¹⁰ This paper studies the aggregate volume of interbank and money market funding rather than studying a specific money market instrument. This allows us to take into account both the European banks' borrowing from U.S. money market mutual funds and total European –mostly secured– interbank lending. The drying-up of the external short-term funding of euro area banks from U.S. money market mutual funds (MMFs hereafter) has been documented by Correa et al. (2013), Chernenko and Sunderam (2014) and Ivashina et al. (2015). Mancini et al. (2015) have documented the partial substitution between unsecured and secured money market funding by European banks. Pérignon et al. (2017) focus on wholesale funding raised through certificates of deposit since 2007, showing that the aggregate volume did not vary significantly and that some banks suffered from a sharp reduction while other did not. By focusing on an aggregate measure of wholesale funding, we therefore avoid the difficulties associated with the treatment of the substitution across different short-term funding sources.

There are two narratives of the euro debt crisis in terms of what caused the drying-up of banks' wholesale funding. Some papers describe the euro crisis as a run on banks caused by their holdings of too much (risky) domestic sovereign debt (see for example Acharya and Steffen (2015)). Others emphasize the macroeconomic origin of the crisis: The expectations of the breakup of the euro area triggered a sharp reduction in cross-border wholesale funding, for fear of counterparty risk. We do not take a position in this debate but instead construct two types of measures of the euro area wholesale funding run that may reflect either one or the other potential causes of runs. We first compute the average funding loss of banks and describe the construction of the variables.

⁹ See for example Chapter 3 “Changes in bank funding patterns and financial stability risks” of the 2013 IMF Global Financial Stability Report, pp. 105–148.

¹⁰ The various issues of the ECB's yearly money market survey document the sharp reduction in funding on the unsecured segment of the interbank market, starting with the subprime crisis in 2007.

Measuring the run. We construct a measure of the loss of wholesale funding by defining a run in terms of two aspects. The first aspect is a “duration” variable measuring the time during which a bank suffered from a reduction in wholesale funding. The second aspect is a variable measuring the “size” of the run. We multiply the "duration" variable by the "size" variable to obtain the “Run” variable. The “duration” variable is a dummy that is set equal to 1 during the period in which the bank had sufficient interbank funding. For a bank, a run starts if its “Interbank funding” variable decreases by at least 10% on a month-on-month basis over the 2010m1-2014m12 period.¹¹

For any bank that has breached the 10% funding loss, we then run a break test in level of one unknown break to decide the date of the end of a run. We set equal to 1 the “duration” variable in all months between these two dates. Otherwise, we set it equal to 0. Tables 4 and 5 compare the statistics of banks that were run with those that were not for the whole sample, while Tables 6 and 7 complement the same statistics as of 2011m1, showing the initial conditions.

The “size” variable measures the size of the run suffered by the bank. The loss is measured as a cumulative loss of wholesale funding computed as the percentage change in wholesale funding between the first and the last month of the run as a percentage of total assets at the bank level. More precisely:

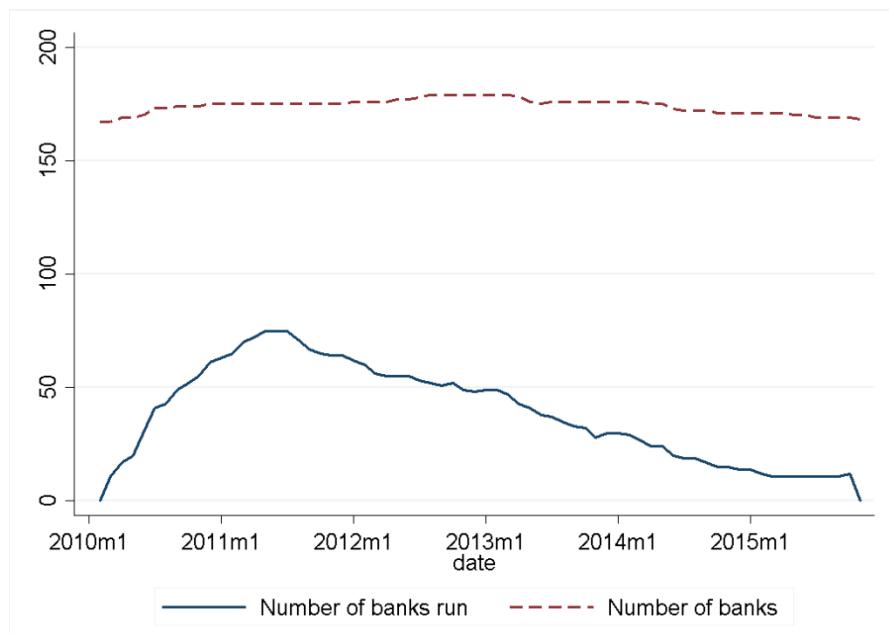
$$size = \frac{Interbank^{last}}{Assets^{last}} - \frac{Interbank^{start}}{Assets^{start}} \quad (1),$$

where the subscript ‘start’ (‘last’) indicates the first (last) month of the run. The Interbank and Assets variables denote the amount of wholesale funding and the total assets of the balance sheet of a bank respectively.

Figure II plots the number of banks that were run according to our definition of a run. It shows that a maximum of 77 banks were simultaneously run during the summer of 2011, among the 177 banks of our sample. The pattern of the curve is similar to other measures of interbank market stress such as the spread between interbank rate and risk-free rate (BOR-OIS).

Figure II: Total number of banks and banks run Jan 2010 - Dec 2014

¹¹ We have checked that all 10% drops in our sample - when they occur - are greater than one standard deviation of the month-on-month changes in interbank funding.



Coverage: 171 banks from the IBSI database of the Eurosystem, see table 1 and text for details.

Source: authors computation using the *IBSI* data on euro-area banks' balance sheet, see text for formulas.

We exploit the IBSI database to describe the main differences between the banks that were run and those that were not. More precisely, Tables 4 and 5 give the average value of the main balance sheet items for banks never run, and the same statistics for banks run at least once over the 2011m1-2014m12 period. The "Run" variable shows that the 102 bank runs correspond to an average wholesale funding loss equivalent to 6% of the bank's total liabilities. At the 95% percentile, this average loss amounts to 19%.

The banks that are run do not seem to differ otherwise on average from the banks that are not run, based on their balance sheet composition. The share of lending to the economy over total assets is 54% vs. 53% respectively. Similarly, the share of interbank lending to the other banks – with 14% vs. 17% respectively – or the share of securities held –with 17% vs. 15% respectively – are identical for the two groups of banks. On the liabilities side, the equity capital and the debt issued by the two types of banks stand at similar levels, although the capital ratio of banks that are run is slightly higher –at 8% vs 7% for banks that are not run. The banks run do not differ in terms of the share of long-term debt (bonds) as a percentage of their total liabilities (15% vs. 16%) either. Finally, the two groups of banks do not differ in terms of the average share of credit claims that they pledge with the Eurosystem, with an average equal to 1 % of total assets in both cases. Credit ratings, available for a subset of banks in our datasets, do not display major differences, with the average rating of banks run being lower by less than one notch than the ratings of banks never run.

We now turn to compare whether the banks that pledge more than 1% of their balance sheet in illiquid collateral differ from those that pledge less than 1% (Tables 8 and 9). Banks that pledge more than 1% of their assets in illiquid collateral tend to have marginally fewer loans in their balance sheet, and rely more on debt issuance to fund their assets. They are more active in intermediating the interbank market, both borrowing and lending more to other banks. They borrow 31% and lend 20% of their balance sheet to other MFIs. By contrast, those pledging less than 1% have the same net interbank position, at -11%, but borrow only 26% and lend 14% of their balance sheet. Interestingly, the central bank refinancing secured by the former is lower than the borrowing of the latter. This suggests that banks that are the most reliant on Eurosystem refinancing do not use more illiquid collateral.

5 Specification and results

Subsection 5.1 presents the specification of the regressions used for the impact of the composition of banks' collateral pools on their lending activity. The results are discussed in Subsection 5.2.

5.1 Specification

We hypothesize that the composition of the collateral pools pledged with the central bank matters for the supply of loans to the economy. More precisely, we are interested in determining whether the share of marketable versus non-marketable assets is neutral on banks' behavior. This may matter for two reasons. First, the cash-equivalent of marketable assets is pro-cyclical, i.e. the cash that can be obtained by selling or collateralizing those assets varies with the market price. The implication is that when the price decreases, the value of the asset as collateral also decreases. This is the financial accelerator mechanism highlighted by Kiyotaki and Moore (1997). By contrast, non-marketable assets are less pro-cyclical since their valuation only depends on their default probability (see Section 2). Therefore, the ability to pledge non-marketable assets insures against price variations. Second, marketable assets have alternative uses such as the ability of being repo-ed on the securitized interbank market or sold quickly on demand. By contrast, credit claims are mainly useful as collateral for central bank refinancing operations, as selling credit claims is costly and lengthy since this requires securitizing them in the form of asset-backed securities or covered bonds. In other words, the opportunity cost of pledging such assets is lower than for other marketable securities. Therefore, when accepting credit claims as collateral, the central bank is relaxing the borrowing constraint of banks (Ahn et al., 2016).

In the absence of an active European securitization market, a run on a sufficient number of banks leads to an aggregate loss of wholesale funding which may trigger a credit crunch. In such a situation, the collateral framework –with respect to quantity and composition– is likely to matter as banks are increasing their demand for central bank reserves. In such a situation, the collateral framework may impact on banks' decision to lend in two cases. In the first case, a bank that is run may decide to pledge more credit claims with the central bank in order to maintain its lending to the economy. In the second case, when competitors are run and the wholesale funding market is frozen, well-capitalized banks that are not run may increase their refinancing with the central bank in order to secure the resources necessary to increase their lending activity to the economy and eventually increase their market share. In a nutshell, by making credit claims eligible collateral, the Eurosystem modifies the incentives to lend to the economy in a period during which holding illiquid assets is less desirable than holding liquid assets.

To test this hypothesis, we regress the loans to non-financial agents (households and non-financial corporations) on the intensity of the variable measuring the run and the variables measuring the composition of the collateral pledged with the central bank. We are primarily interested in determining whether the coefficient of the illiquid variable is significantly greater than zero, i.e. whether a bank's ability to pledge more illiquid collateral increases its lending to the economy. The regression equation reads as follows:

$$\begin{aligned} \text{Loans}_{bk,t} = \\ \rho \text{Loans}_{bk,t-1} - \alpha \text{Capital ratio}_{bk,t-1} + \beta \text{Tot. collat}_{bk,t} + \epsilon \text{Illiq. Collat}_{bk,t} + \gamma \text{Run}_{bk,t-1} + \\ \delta [\text{Run}_{bk,t-1} \times \text{Tot. collat}_{bk,t}] + \zeta [\text{Run}_{bk,t-1} \times \text{Illiq. collat}_{bk,t}] + \text{FE}_{bk} + \text{FE}_{country,t} + \varepsilon_{bk,t} \end{aligned} \quad (2)$$

where the index bk (t) denotes a bank (the date, month and year). To account for the inertia in loan creation, we also include the lagged dependent variable as an explanatory variable. All of the variables are computed as a share of the lagged total assets of the bank to take account of the fact that banks vary in size and to make them comparable.

We focus on the variables $\text{Tot. collat}_{bk,t}$ and $\text{Illiq. Collat}_{bk,t}$ which stand for the total volume of collateral and the volume of illiquid assets pledged with the central bank respectively. The coefficient β measures to what extent the volume of collateral pledged by a bank increases its loan supply. The coefficient ϵ assesses whether credit claims play an additional role in determining lending decisions. We expect both to be positive. The variable $\text{Run}_{bk,t-1}$ stands for the intensity of the run at the bank level for the previous month (see Section 4 for details). We expect its coefficient γ to be negative.

We also include interactions between this $Run_{bk,t-1}$ variable and each collateral variable to allow for a non-linear impact of collateral in times of wholesale funding loss. Note that the pledging of illiquid collateral takes time and comes with significant legal costs like the physical delivery of credit documentation to the central bank in some jurisdictions (Tamura and Tabakis, 2013).¹² It is therefore very unlikely that newly originated loans are pledged as collateral with the Eurosystem over the couple of months that follow their origination. We believe that a contemporaneous positive and significant relationship between loans and illiquid collateral can hardly result from such a bias.

We also include some control variables to account for potential confounding factors in the regression. The variable FE_{bk} denotes the inclusion of bank fixed-effects to account for the heterogeneity of banks' business models. The variable $FE_{country,t}$ corresponds to the country-time fixed effects. They capture potential country-specific shocks on the banking sector as well as common shocks affecting demand for loans. The underlying assumption is that banks face relatively homogenous demand for loans in a specific country. We also control for the quality of banks by including the capital ratio (computed as the ratio of equity to lagged total assets). Residuals are clustered at the bank level to allow for heterogeneity in the distribution of shocks at the bank level. The residual of the regression is denoted by $\varepsilon_{bk,t}$.

We also conduct robustness exercises. The first robustness exercise consists in replacing the variable $Illiq.Collat_{bk,t}$ in equation (2) by the difference between the volume of illiquid assets pledged and the volume of liquid assets pledged ($Illiq.-Liq.Collat_{bk,t}$). The coefficient in front of this variable can be interpreted as the impact of increasing the share of illiquid assets in the collateral pool while keeping the total volume collateral unchanged.

The second robustness check removes the last semester from the estimation period. Indeed, some may be concerned by the fact that the Targeted Longer-Term Refinancing Operations (TLTROs) launched in June 2014 may have altered the relationship between bank lending and the refinancing activity of the bank.

¹² See Tamura and Tabakis (2013): "The relatively high operational costs of the use of credit claims as collateral can also be seen in the additional eligibility and operational requirements for credit claims that are not required for marketable assets (see Table 3). The requirements relate to: (i) ex ante notification of the debtor about mobilisation (in some jurisdictions); (ii) physical delivery of related loan documents; (iii) transferability of credit claims; and (iv) reporting requirement of counterparties regarding the existence of credit claims. These conditions which are directly required by national legislations (e.g. i and iii) or reflect central bank policies (e.g. iv) imply that credit claims are not normally assets which are expected to trade with high frequency."

The third robustness check consists in including the bank's rating as an additional control variable for the quality of banks. Given that ratings are available only for a subset of banks, it substantially reduces the sample size.

5.2 Results

Table 10 reports the main regression estimates in which we introduce one explanatory variable after another. The results show that an increase in the volume of illiquid collateral pledged with the central bank is associated with a significant increase in loans to the economy. The coefficient of $Illiq.Collat_{bk,t}$ shows that a 1% increase in the volume of illiquid collateral pledged with the central bank (as a percentage of the bank's total assets) leads to about a 0.3% increase in the loans-to-total-assets ratio. This is economically significant as a one standard deviation increase in the volume of illiquid collateral leads to a 0.6% increase in lending activity, which is consistent with our hypothesis that the eligibility of illiquid collateral boosts bank lending activity.

We also find a positive correlation between the total volume of collateral pledged (irrespective of its liquidity) and loans. Our main contribution is to stress for a given level of collateral pledged, the importance of the liquidity composition of the collateral pool for lending activity. Eligible credit claims, with low default probability, are unlikely to raise moral hazard issues. In addition, to account for the quality of banks, we include the capital ratio in the estimates. The capital ratio is positive and significant suggesting that an increase in the capital ratio is associated with more loans to the economy.

The wholesale funding loss as measured by $Run_{bk,t-1}$ has a significant and negative impact on bank lending. The impact is significant. For a 1 standard deviation of the run intensity for banks that are hit by a run at least once in our sample –i.e. a 9% loss of wholesale funding– the bank reduces its loans-to-total-assets ratio by 0.5%. The impact of the loss of wholesale funding on loans is attenuated when banks pledge more collateral with the central bank: the interaction between the intensity of the run and the total volume of collateral is positive and significant in most specifications (including in Table 13 when we control for banks' ratings).

Table 11 gives the result of changing the specification of the variable measuring the impact of illiquid collateral on bank lending. The result shows that there is a clear composition effect, as the coefficient of the variable $Illiq.-Liq.Collat_{bk,t}$ is positive and significant. Finally, the results are unchanged when we exclude the last semester from the estimation period in Table 12 or when we control for bank ratings in Table 13.

6 Conclusion

We study the impact of banks' ability to pledge illiquid collateral on their lending activity during the European sovereign debt crisis. By doing so, they were able to convert illiquid loans into liquid reserves at the central bank. To identify the beneficial impact of the (il)liquidity of collateral on the loan supply of individual banks, we make use of the differences in the share of illiquid collateral banks are able to pledge. This proportion varies both in the cross-section and in the time series. We then show that banks that pledged more illiquid assets against central bank reserves were those that reduced their lending to the economy less.

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7 Appendix

Table 3: Haircut grid applicable to credit claims used as collateral, as a %

Residual mat.	Valuation (1)		Valuation(2)		RMB debt (3)
	AAA to A-	BBB+ to BBB-	AAA to A-	BBB+ to BBB-	AAA to A-
<1y	10	17	12	19	39,5
1-3y	12	29	16	34	39,5
3-5y	14	37	21	46	39,5
5-7y	17	39	27	52	39,5
7-10y	22	40	35	58	39,5
10y	30	42	45	65	39,5

<https://www.ecb.europa.eu/mopo/assets/risk/liquidity/html/index.en.html>

Note: Valuation (1) is based on a theoretical price assigned by the NCB Valuation (2) according to the outstanding amount assigned by the NCB

(3) Non-marketable residential mortgage-backed debt

Table 4: Summary statistics, banks never run (2011m1-2014m12)

Variable	Obs	Meann	Std. Dev.	P5	P95
Run	3559	0	0	0	0
Illiq. collat	3559	.8	1.6	0	3.1
Liq. collat	3559	4.1	5.4	0	14.1
Tot. collat	3559	4.9	5.8	0	15.2
Bonds held	3455	15.4	9.5	1.1	31.7
Loans	3559	53.1	21.1	10.4	82.2
Debt issued	3559	15.3	17.7	0	44.2
Interbank lending	3559	17.7	15.8	1.9	48.4
Interbank borrowing	3559	28.6	22.4	3.6	79.3
Net interbank position	3559	-11	21.6	-54.3	22.3
CB refinancing	3559	1.8	3.8	0	11.3
Capital ratio	3559	8	4.2	2.5	14.7
Rating	1944	5.8	2.9	1	12

All variables as a % except Rating

Rating: 1=AAA, increment of 1 corresponds to one notch

Table 5: Summary statistics, banks run at least once (2011m1-2014m12)

Variable	Obs	Mean	Std. Dev.	P5	P95
Run	4840	5.4	8.9	0	20.3
Illiq. collat	4840	1.2	2	0	5.3
Liq. collat	4840	6.9	10.2	0	19.3
Tot. collat	4840	8	10.3	0	20.8
Bonds held	4791	18.2	10.5	.7	37.6
Loans	4840	54.6	18.1	25.1	79
Debt issued	4840	15.5	17	0	49.7
Interbank lending	4840	13.3	11.5	1.6	32.9
Interbank borrowing	4840	21	17.3	2.9	57.5
Net interbank position	4840	-7.7	16.3	-35.3	13.1
CB refinancing	4840	3.5	5.5	0	15.4
Capital ratio	4840	8.8	6.3	2.1	19.1
Rating	2435	6.8	3.2	3	13

All variables as a % except Rating

Rating: 1=AAA, increment of 1 corresponds to one notch

Table 6: Summary statistics, banks never run, as of 2011m1

Variable	Obs	Mean	Std. Dev.	P5	P95
Run	75	0	0	0	0
Illiq. collat	75	.7	1.4	0	2.8
Liq. collat	75	3.4	3.3	0	10.7
Tot. collat	75	4.1	3.6	0	10.8
Bonds held	72	15.3	8.9	1.4	29.3
Loans	75	53.3	21.2	11.9	87.4
Debt issued	75	16.9	17.9	0	46.5
Interbank lending	75	17.3	15.7	2.2	47.4
Interbank borrowing	75	28.5	21.8	4.3	76.6
Net interbank position	75	-11.1	21.5	-53.1	19.8
CB refinancing	75	1	2.3	0	6.9
Capital ratio	75	7.4	3.6	2.4	14
Rating	40	4.8	1.7	1	7.5

All variables as a % except Rating

Rating: 1=AAA, increment of 1 corresponds to one notch

Table 7: Summary statistics, banks run at least once (2011m1-2014m12), as of 2011m1

Variable	Obs	Mean	Std. Dev.	P5	P95
Run	102	6	9.1	0	18.6
Illiq. collat	102	.8	1.5	0	4.1
Liq. collat	102	6	9.1	0	18.3
Tot. collat	102	6.8	9.1	0	18.3
Bonds held	101	17.3	10.1	.3	33.2
Loans	102	54.2	19.2	21.9	79.1
Debt issued	102	16.1	17.3	.1	54.8
Interbank lending	102	14.5	12	1.7	34
Interbank borrowing	102	25.9	18.1	4.7	59.1
Net interbank position	102	-11.4	17.5	-44.3	7.3
CB refinancing	102	2.4	5.4	0	12.2
Capital ratio	102	7.6	4.3	1.7	14.1
Rating	48	5.4	2.1	2	9

All variables as a % except Rating

Rating: 1=AAA, increment of 1 corresponds to one notch

Table 8: Summary statistics, banks pledging less than 1% of their balance sheet in credit claims, as of 2011m1

Variable	Obs	Mean	Std. Dev.	P5	P95
Run	133	3.8	8.2	0	18.4
Illiq. collat	133	.1	.2	0	.7
Liq. collat	133	5.2	8.1	0	14.9
Tot. collat	133	5.3	8.1	0	14.9
Bonds held	129	16.6	9.8	1.3	31.4
Loans	133	56.1	19.8	16.9	83.9
Debt issued	133	14.2	15.3	0	45.9
Interbank lending	133	14.3	12.8	2	40.5
Interbank borrowing	133	25.5	19.9	4.3	65.9
Net interbank position	133	-11.3	19.5	-51.7	11.8
CB refinancing	133	2	5	0	11.7
Capital ratio	133	7.7	4.2	1.7	14.8
Rating	60	5.4	2	2.5	9

All variables as a % except Rating

Rating: 1=AAA, increment of 1 corresponds to one notch

Table 9: Summary statistics, banks pledging more than 1% of their balance sheet in credit claims, as of 2011m1

Variable	Obs	Mean	Std. Dev.	P5	P95
Run	44	2.4	4.8	0	14.3
Illiq. collat	44	2.7	1.8	1.1	6.1
Liq. collat	44	4	4.6	0	10.6
Tot. collat	44	6.7	4.7	1.5	12.6
Bonds held	44	15.9	9.4	1.4	30.8
Loans	44	47	19.4	17.5	79.1
Debt issued	44	23.4	21.6	.5	86.2
Interbank lending	44	19.9	15.4	5.3	47
Interbank borrowing	44	31.4	18.7	5.3	64.3
Net interbank position	44	-11.5	18.9	-44.3	3.7
CB refinancing	44	.9	1.7	0	4.6
Capital ratio	44	6.8	3.2	3.2	13.6
Rating	28	4.5	1.7	1	7

All variables as a % except Rating

Rating: 1=AAA, increment of 1 corresponds to one notch

Table 10: Bank loans and collateral liquidity

	(1)	(2)	(3)	(4)	(5)	(6)
	Loans	Loans	Loans	Loans	Loans	Loans
Loans(t-1)	0.774*** (0.0443)	0.771*** (0.0451)	0.771*** (0.0446)	0.772*** (0.0446)	0.769*** (0.0454)	0.765*** (0.0457)
Capital ratio	0.425*** (0.119)	0.430*** (0.119)	0.439*** (0.128)	0.443*** (0.128)	0.447*** (0.128)	0.446*** (0.128)
Tot. collat	0.0250*** (0.00737)	0.0230*** (0.00807)		0.0266*** (0.00693)	0.0245*** (0.00729)	0.0265** (0.0119)
Illiq. collat		0.282*** (0.0881)			0.277*** (0.0862)	0.279*** (0.0868)
Run			-0.0235 (0.0245)	-0.0261 (0.0244)	-0.0252 (0.0242)	-0.0564** (0.0249)
Run × Tot. collat						0.248** (0.101)
Run × Illiq. collat						-0.265 (0.609)
Adjusted R^2	0.662	0.664	0.662	0.663	0.664	0.666
Observations	8221	8221	8221	8221	8221	8221

Standard errors in parentheses. All variables at the bank level

Note: Panel regression with residuals clustered at bank level, time, bank and country-time fixed effects.

* $p < 0.10$, ** $p < 0.05$, *** $p < 0.01$

Table 11: Bank loans and collateral liquidity

	(1) Loans	(2) Loans	(3) Loans	(4) Loans	(5) Loans	(6) Loans
Loans(t-1)	0.774*** (0.0443)	0.771*** (0.0451)	0.771*** (0.0446)	0.772*** (0.0446)	0.769*** (0.0454)	0.765*** (0.0457)
Capital ratio	0.424*** (0.119)	0.430*** (0.119)	0.439*** (0.128)	0.442*** (0.128)	0.447*** (0.128)	0.446*** (0.128)
Tot. collat	0.0250*** (0.00745)	0.164*** (0.0439)		0.0265*** (0.00697)	0.163*** (0.0431)	0.166*** (0.0443)
Illiq. - Liq. collat		0.141*** (0.0440)			0.139*** (0.0431)	0.140*** (0.0434)
Run			-0.0235 (0.0246)	-0.0262 (0.0243)	-0.0252 (0.0242)	-0.0564** (0.0249)
Run × Tot. collat						0.115 (0.299)
Run × Illiq. - Liq. collat						-0.133 (0.304)
Adjusted R^2	0.662	0.664	0.662	0.663	0.664	0.666
Observations	8221	8221	8221	8221	8221	8221

Standard errors in parentheses

All variables at the bank level

Note: Panel regression with residuals clustered at bank level, time, bank and country-time fixed effects.

* $p < 0.10$, ** $p < 0.05$, *** $p < 0.01$

Table 12: Bank loans and collateral liquidity, subsample 2011m1-2014m6

	(1) Loans	(2) Loans	(3) Loans	(4) Loans	(5) Loans	(6) Loans
Loans(t-1)	0.754*** (0.0499)	0.751*** (0.0506)	0.750*** (0.0505)	0.751*** (0.0505)	0.749*** (0.0511)	0.746*** (0.0515)
Capital ratio	0.464*** (0.135)	0.469*** (0.135)	0.490*** (0.149)	0.491*** (0.149)	0.494*** (0.148)	0.498*** (0.151)
Tot. collat	0.0291*** (0.00856)	0.0271*** (0.00948)		0.0315*** (0.00744)	0.0295*** (0.00810)	0.0297** (0.0126)
Illiq. collat		0.291*** (0.102)			0.280*** (0.0980)	0.285*** (0.0988)
Run			-0.0295 (0.0276)	-0.0334 (0.0269)	-0.0319 (0.0268)	-0.0626** (0.0291)
Run × Tot. collat						0.239** (0.0941)
Run × Illiq. collat						-0.197 (0.666)
Adjusted R^2	0.628	0.629	0.628	0.629	0.630	0.632
Observations	7206	7206	7206	7206	7206	7206

Standard errors in parentheses

All variables at the bank level

Note: Panel regression with residuals clustered at bank level, time, bank and country-time fixed effects.

* $p < 0.10$, ** $p < 0.05$, *** $p < 0.01$

Table 13: Bank loans and collateral liquidity when controlling for credit rating

	(1) Loans	(2) Loans	(3) Loans	(4) Loans	(5) Loans	(6) Loans
Loans(t-1)	0.628*** (0.0881)	0.619*** (0.0885)	0.629*** (0.0890)	0.628*** (0.0886)	0.620*** (0.0887)	0.616*** (0.0889)
Capital ratio	0.543** (0.238)	0.550** (0.235)	0.609** (0.265)	0.614** (0.261)	0.611** (0.258)	0.668** (0.283)
Rating	-0.00034 (0.00208)	-0.00088 (0.00210)	-0.00012 (0.00213)	-0.00012 (0.00216)	-0.000650 (0.00216)	-0.000734 (0.00224)
Tot. collat	0.0425* (0.0254)	0.0319 (0.0287)		0.0489** (0.0228)	0.0383 (0.0253)	0.0182 (0.0341)
Illiq. collat		0.499*** (0.156)			0.459*** (0.143)	0.463*** (0.147)
Run			-0.0527 (0.0508)	-0.0576 (0.0499)	-0.0502 (0.0501)	-0.106* (0.0623)
Run × Tot. collat						0.846** (0.333)
Run × Illiq.						-0.512 (1.302)
Adjusted R^2	0.560	0.565	0.561	0.563	0.567	0.571
Observations	4290	4290	4290	4290	4290	4290

Standard errors in parentheses

All variables at the bank level

Note: Panel regression with residuals clustered at bank level, time, bank and country-time fixed effects.

* $p < 0.10$, ** $p < 0.05$, *** $p < 0.01$