# **DISCUSSION PAPER SERIES**

# DP16693

# Bank Credit and Market-based Finance for Corporations: The Effects of Minibond Issuances

Steven Ongena, Sara Pinoli, Paola Rossi and Alessandro Diego Scopelliti

**FINANCIAL ECONOMICS** 



# Bank Credit and Market-based Finance for Corporations: The Effects of Minibond Issuances

Steven Ongena, Sara Pinoli, Paola Rossi and Alessandro Diego Scopelliti

Discussion Paper DP16693 Published 03 November 2021 Submitted 12 November 2020

Centre for Economic Policy Research 33 Great Sutton Street, London EC1V 0DX, UK Tel: +44 (0)20 7183 8801 www.cepr.org

This Discussion Paper is issued under the auspices of the Centre's research programmes:

#### Financial Economics

Any opinions expressed here are those of the author(s) and not those of the Centre for Economic Policy Research. Research disseminated by CEPR may include views on policy, but the Centre itself takes no institutional policy positions.

The Centre for Economic Policy Research was established in 1983 as an educational charity, to promote independent analysis and public discussion of open economies and the relations among them. It is pluralist and non-partisan, bringing economic research to bear on the analysis of medium- and long-run policy questions.

These Discussion Papers often represent preliminary or incomplete work, circulated to encourage discussion and comment. Citation and use of such a paper should take account of its provisional character.

Copyright: Steven Ongena, Sara Pinoli, Paola Rossi and Alessandro Diego Scopelliti

# Bank Credit and Market-based Finance for Corporations: The Effects of Minibond Issuances

#### **Abstract**

Does a diversification of funding sources affect the financing conditions for firms? To answer this question we study a regulatory reform which allowed unlisted firms to issue minibonds. Using the Italian Credit Register, we compare new loans granted to issuer firms with new loans concurrently granted to similar non-issuer firms. We find that issuer firms obtain lower interest rates on bank loans of the same maturity than non-issuer firms, suggesting an improvement in their bargaining power with banks. Issuer firms also reduce the amount of used bank credit, expand their total and fixed assets, and raise their leverage.

JEL Classification: G21, G23, G32, G38

Keywords: Bank credit, Capital Markets, minibonds, Loan pricing, SME finance

Steven Ongena - steven.ongena@bf.uzh.ch University of Zurich and CEPR

Sara Pinoli - Sara.Pinoli@bancaditalia.it Banca d'Italia

Paola Rossi - Paola.Rossi@bancaditalia.it Banca d'Italia

Alessandro Diego Scopelliti - alessandrodiego.scopelliti@kuleuven.be KU Leuven, European Central Bank and University of Zurich

#### Acknowledgements

We wish to thank Carlo Altavilla, Thorsten Beck, Marina Brogi, Claire Célérier (discussant), Olivier Darmouni, Carmine Di Noia, Annalisa Ferrando, Paolo Finaldi Russo, Xavier Freixas, Mariassunta Giannetti, Christoph Herpfer, Guillaume Horny (discussant), Victoria Ivashina, Angela Maddaloni, Francesco Manaresi, Valentina Michelangeli (discussant), Melina Papoutsi (discussant), Fabio Parlapiano, Francesco Saita, Fabiano Schivardi, Andrea Sironi, Amit Seru, Boris Vallée, Zhang Xiang (discussant), the participants at the 2021 American Finance Association Annual Meeting (e-Chicago), the 2020 European Economic Association Conference (e-Rotterdam), the 2019 Conference "Securities Markets. Trends, Risks and Policies" at Bocconi University (Milano), the 2019 Swiss Winter Conference on Financial Intermediation (Lenzerheide), the 4th ENTFIN Conference on Entrepreneurial Finance (Trier), the 2019 Conference on "Regulating Financial Markets" at Goethe University (Frankfurt), the 3rd Annual Workshop of the ESCB Research Cluster 3 on "Financial Stability, Macroprudential Regulation and Microprudential Supervision" at the Banco de España (Madrid), and the seminar participants at the European Central Bank (Frankfurt) and the Banca d'Italia (Rome) for their many insightful comments. Ongena and Scopelliti acknowledge financial support from ERC ADG 2016 - GA 740272 lending. The views presented in this paper are those of the authors and should not be attributed to Banca d'Italia, the European Central Bank or the Eurosystem.

# **Bank Credit and Market-based Finance for Corporations:**

# The Effects of Minibond Issuances\*

Steven Ongena<sup>†</sup> Sara Pinoli<sup>‡</sup> Paola Rossi<sup>§</sup> Alessandro Scopelliti<sup>\*\*</sup>

#### **Abstract**

Does a diversification of funding sources affect the financing conditions for firms? To answer this question we study a regulatory reform which allowed unlisted firms to issue minibonds. Using the Italian Credit Register, we compare new loans granted to issuer firms with new loans concurrently granted to similar non-issuer firms. We find that issuer firms obtain lower interest rates on bank loans of the same maturity than non-issuer firms, suggesting an improvement in their bargaining power with banks. Issuer firms also reduce the amount of used bank credit, expand their total and fixed assets, and raise their leverage.

**Keywords:** Bank Credit; Capital Markets; Minibonds; Loan Pricing; SME Finance.

JEL Classification: G21; G23; G32; G38

<sup>\*</sup>We wish to thank Carlo Altavilla, Thorsten Beck, Marina Brogi, Claire Célérier (discussant), Olivier Darmouni, Carmine Di Noia, Annalisa Ferrando, Paolo Finaldi Russo, Xavier Freixas, Mariassunta Giannetti, Christoph Herpfer, Guillaume Horny (discussant), Victoria Ivashina, Angela Maddaloni, Francesco Manaresi, Valentina Michelangeli (discussant), Melina Papoutsi (discussant), Fabio Parlapiano, Francesco Saita, Fabiano Schivardi, Andrea Sironi, Amit Seru, Boris Vallée, Zhang Xiang (discussant), the participants at the 2021 American Finance Association Annual Meeting (e-Chicago), the 2020 European Economic Association Conference (e-Rotterdam), the 2019 Conference "Securities Markets. Trends, Risks and Policies" at Bocconi University (Milano), the 2019 Swiss Winter Conference on Financial Intermediation (Lenzerheide), the 4<sup>th</sup> ENTFIN Conference on Entrepreneurial Finance (Trier), the 2019 Conference on "Regulating Financial Markets" at Goethe University (Frankfurt), the 3<sup>rd</sup> Annual Workshop of the ESCB Research Cluster 3 on "Financial Stability, Macroprudential Regulation and Microprudential Supervision" at the Banco de España (Madrid), and the seminar participants at the European Central Bank (Frankfurt) and the Banca d'Italia (Rome) for their many insightful comments. Ongena and Scopelliti acknowledge financial support from ERC ADG 2016 - GA 740272 lending. The views presented in this paper are those of the authors and should not be attributed to Banca d'Italia, the European Central Bank or the Eurosystem.

<sup>†</sup> University of Zurich, Swiss Finance Institute, KU Leuven and CEPR, Steven.Ongena@bf.uzh.ch

<sup>‡</sup> Banca d'Italia, Sara.Pinoli@bancaditalia.it

<sup>§</sup> Banca d'Italia, Paola.Rossi@bancaditalia.it

<sup>\*\*</sup> KU Leuven, European Central Bank and University of Zurich, alessandrodiego.scopelliti@kuleuven.be

#### 1. Introduction

The integration between bank credit and market-based finance for corporations is at the center of the current policy debate, due to the strong dependence of firms and particularly small and medium-sized enterprises (SMEs) on bank credit for their funding needs, especially in Europe.

This long-standing feature has become even more topical in the discussion on the alternatives to bank credit in the recovery from the Covid-19 crisis and on the policy solutions to revitalize the corporate sector. While the strong response of policy authorities has provided support to firms by fostering bank credit at the peak of the crisis, the future ability of the banking sector to finance the recovery may be hindered due to potential cliff effects in the phase-out of policy measures (in addition of course to pre-existing vulnerabilities). In this perspective, easing access to market-based financing sources may reduce firms' overly reliance on bank debt, support their investments and growth or improve their liquidity position.

In previous years, policy authorities had considered various initiatives to extend the range of funding sources for SMEs, including the removal of existing regulatory obstacles to the use of market-based funding, as in the US with the 2012 JOBS Act and in the European Union with the ongoing initiatives for the Capital Markets Union.<sup>4</sup> Now, in light of the fallout from the Covid-19 crisis and of the new financing needs for firms, it is important to assess the effects of some recent policy initiatives developed in the area of capital markets, to draw relevant implications for the forthcoming policy design.

Our paper contributes to the literature on the choice between bank credit and market-based finance for firms, and particularly on the effects of the use of market funding on corporate financing conditions and performance. While the theoretical literature has explored costs and benefits associated with this choice and identified firms characteristics that may explain a higher propensity or a better ability to

<sup>&</sup>lt;sup>1</sup> See for instance Financial Times (2020); Group of Thirty (2020).

<sup>&</sup>lt;sup>2</sup> For a recent study on the effects of the monetary, micro- and macroprudential policy measures adopted during the pandemic on bank lending conditions in the euro area, see Altavilla, Barbiero, Boucinha and Burlon (2020). See also Beck, Bruno and Carletti (2021), Financial Stability Board (2021), and Rancoita et al. (2020) for a discussion on cliff effects from withdrawing Covid-related policy measures in support of the banking sector, like loan guarantee schemes and moratoria.

<sup>&</sup>lt;sup>3</sup> Capital markets can support the diversification of funding sources for firms in case of potential supply constraints for bank credit (Becker and Ivashina, 2014 and 2018). Recent empirical evidence for the US (Darmouni and Siani, 2021) shows the central role played by the bond market, following the Covid-19 shock, to firms' access to liquidity, with many issuers leaving their bank credit lines untouched and others using bond proceeds to repay existing loans.

<sup>4</sup> While in the US firms can benefit from largely developed capital markets, in Europe – despite some initiatives at the national level - capital markets are still segmented across countries, which reduces also the potential investor base. For this reason, and given the limited progress in the agenda so far, renewed policy commitments towards the Capital Markets Union were recently strengthened by EU policy-amkers (see for instance De Guindos, Panetta and Schnabel, 2020; High-Level Forum on the Capital Markets Union, 2020; Wieser, 2020).

access capital markets funding (Diamond, 1991; Holmstrom and Tirole, 1997), the empirical literature is still limited and concentrated on public listing decisions (for Italy, Pagano, Panetta and Zingales, 1998; for the US, Schenone, 2010), mostly for very large firms.

We investigate the impact of the diversification of funding sources – following the issuance of corporate bonds – on the financing conditions of issuer firms with a particular focus on their lending relationships with banks. This is particularly relevant for SMEs, as these firms – also in the case of bond issuance – may still rely to a significant extent on bank credit due to the potential benefits of lending relationships. Banks are able to gather soft information about firms and to perform monitoring activity, thus reducing agency costs and providing effective incentives to firms in favor of high-quality investments (Diamond, 1984; Rajan, 1992). The flip side of the coin is that the incumbent banks can extract some monopoly rents due to their informational advantage (hold-up effect; Sharpe, 1990; Von Thadden, 2004) and, consequently, strong dependence on bank credit may lead to an increase in financing costs.

It is therefore crucial to explore whether the diversification of funding sources through capital markets allows issuer firms to improve their bargaining power with banks in setting the credit conditions, and to examine to what extent the ability to issue corporate bonds affects their debt structure. Such empirical analysis presents two main challenges: first, we need to identify an exogenous event enacting the ability of firms to get capital markets funding, such that firms previously unable to issue corporate bonds would then be allowed to do it; second, for a given sample of issuer firms (treated) we have to construct a counterfactual sample of non-issuer firms (control) with ex-ante comparable financial characteristics.

The introduction of a recent regulatory reform in Italy provides an interesting experiment to study the ex-post consequences of bond issuance on corporate credit conditions, within an empirical setting useful to deal with the above challenges.<sup>5</sup> In 2012 a reform aimed at improving the access to capital markets by small and medium enterprises was introduced in Italy. It removed the pre-existing limits to the issuance of corporate bonds by unlisted firms, provided that the securities were negotiated in a regulated market or in a multilateral trading facility open only to professional investors. It also extended to these bonds the favorable tax treatment established for the bonds issued by listed firms. Since the new bond issues were expected to be of limited amounts, they were called "minibonds".

<sup>&</sup>lt;sup>5</sup> Italy provides a particularly interesting framework thanks to the large presence of SMEs in the economy and to the multiplicity of firm-bank relationships also for relatively small corporations.

We exploit this regulatory shock in order to investigate the ex-post impact of the issuance of minibonds on the credit conditions charged by banks to issuer firms, both at the firm-bank level and at the firm-level, as well as, on the performance of issuer firms.

We study the effects of the switching behavior of firms from bank credit to debt funding and for this purpose we extend the empirical framework developed by Ioannidou and Ongena (2010) to the issuance of debt instruments. In particular, we analyze whether corporate issuers were able to obtain lower lending rates from banks after the minibond issuance, compared to ex-ante similar non-issuer firms. On one hand, the diversification of funding sources may improve the bargaining power of firms in the lending relationship, so it could eventually lead to an improvement of loan conditions for firms. On the other hand, if the market rates required by investors are still higher than the bank rates, as for the first issuances of minibonds, credit institutions may have relatively less incentive to ease the lending conditions for corporations.

We consider the issuances of minibonds starting from the fourth quarter of 2012 to the end of 2016 and we focus on the first issuance for each firm, as this will provide the first clear message that the firm is able to get funding directly from capital markets. Since the loan offer to a treated firm in the case of non-issuance would not be observable, we match the new loans granted to issuer firms with the new loans granted at the same time to non-issuer firms that have similar pre-determined characteristics. To build the counterfactual sample of non-issuer firms we implement a coarsened exact matching on a wide set of ex-ante firms' characteristics and balance sheet performance.

Our dataset combines various sources. We merge the deal-level information on minibond issuances by Italian firms with the loan-level data on firm-bank relationships and with the corporate balance sheets of issuer and non-issuer firms. We collect the data on the issuances of minibonds from the "Borsa Italiana" (Italy's stock exchange based in Milan), as minibonds are frequently negotiated on a multilateral trading platform called ExtraMOT Pro and reserved to professional investors, and the Observatory Minibond, by the Polytechnic University of Milan. Loan-level data come from the Italian Credit Register ("Centrale dei Rischi"), combined with the quarterly survey on lending rates conducted by the Bank of Italy at the loan level.

The effect of the minibond issuance is measured in the quarter of the first issuance and in the following two quarters, compared to the two quarters before the event.<sup>6</sup> The difference-in-differences analysis on lending rates, both at the firm-bank level and at the firm level, shows that issuer firms obtained – after their first issuance – a reduction in the lending rates charged by banks versus ex-ante

<sup>&</sup>lt;sup>6</sup> Our estimates over a longer period, including six quarters after the issuance, show similar results.

similar non-issuer firms. The decrease in lending rates observed at the firm-level was around 40 basis points for long-term loans and around 28 basis points for advances. Lending rate reductions of around 30 basis points were also observed in the analysis at the firm-bank level, both for long-term loans and for advances.

The corresponding analysis on lending volumes at the firm-level shows that issuer firms reduced the amount of used credit by around 35 percent, suggesting that the minibond issuances were used to substitute part of the previous bank debt. The decrease in the amount of credit granted by banks to issuer firms was smaller (around 10 percent) and not quite statistically significant. Taking into account the two effects combined, after the first issuance issuer firms reduced by around 11 percentage points the ratio between credit used and credit granted, a measure commonly used as a proxy for credit constraints. Considering the amounts raised in the market with the minibond issuance, the overall effect is an increase by around 40 percent of the total external funds the issuer firms can rely upon. Importantly, this significant increase in the total financial debt was achieved by issuer firms without a statistically significant change in their overall financing costs: indeed, the swift reduction in bank lending rates after the first issuance balanced the higher coupon rates on minibond issuances.

These results support the argument that the access to capital markets allows firms to diversify their funding sources and to improve their credit conditions, with a reduction in interest rates on bank debt and an increase in the overall funds they have access to. We find a significant impact of minibond issuances on firm-bank relationships even though these bonds were often more costly than bank credit. The effect is not significantly different between inside and outside banks, even if outside banks may have the incentive to offer more favourable lending conditions (as in Ioannidou and Ongena, 2010), but independently from the minibond issuance.

Exploring the heterogeneity across firms, we find that the reduction in bank lending rates is stronger for firms issuing minibonds of relatively larger amount relative to their existing financial debt, as these issuances would allow for greater credit substitution and for a more sizeable decrease in banks' exposures, then contributing to a better credit risk assessment of issuer firms. Futhermore, the effect is larger for firms which were already less reliant on their main bank, while firms more subject to hold-up may still use minibonds to diversify their funding sources but with limited credit substitution.

<sup>&</sup>lt;sup>7</sup> In our analysed sample of first-time issuers, the average coupon is around 6 percent, 100 basis points more than the average interest rate charged by banks.

Overall, our results suggest an improved bargaining power for the first time issuers, although the effect on financing costs may be partially due to the changes in debt composition in favor of long-term debt, which might have enhanced the debt sustainability of issuer firms.<sup>8</sup>

Our findings on bank lending conditions and volumes raise the question whether this improvement in financial conditions had some impact on the performance of firms. We estimate a difference-in-differences model for some indicators of asset and liability composition, turnover and profitability. We find that issuer firms – after the first minibond issuance – increase their amount of total assets and of fixed assets, raise their leverage while reducing the share of bank debt out of total financial debt, thanks to the funding diversification. Firms' turnover and profitability are not significantly affected.

The remainder of the paper is structured as follows. Section 2 reviews the literature on bank credit and capital market finance. Section 3 presents the institutional background and some stylized facts about minibond issuances. Section 4 introduces the data and describes the empirical strategy. Section 5 presents the results of the analysis at the firm-bank level, while Section 6 discusses the analysis at the firm-level. Section 7 presents the results of some robustness analyses. Finally, Section 8 concludes.

#### 2. Related Literature

Our paper contributes to three main strands of literature: the choice between bank credit and capital markets for corporations; the relation between firm capital structure and financing costs; and, the benefits and costs of bank lending relationships.

The choice among different sources of financing is a complex decision, which depends upon several factors and incentives, both firm-specific and economy-wide, and may have significant implications on corporate costs and performance. The traditional corporate finance literature based on the pecking order theory (Myers and Majluf, 1984) has highlighted the role of asymmetric information between the firm and its investors: since the cost of finance increases with asymmetric information, companies would first use internal financing; then, if external financing is required, they would prefer to issue debt rather than new equity. Firms can obtain external debt financing either from an informed lender, like a bank, or from an uninformed arm's-length investor, via capital markets (Rajan, 1992).

<sup>&</sup>lt;sup>8</sup> This is in line with previous evidence showing the role of bond issuances in reducing maturity mismatches between assets and liabilities (Accornero et al., 2015).

<sup>&</sup>lt;sup>9</sup> In the pecking order theory, companies would prefer to issue debt rather than new equity, both to avoid the dilution of the existing shares, and because investors would perceive debt as less risky than equity due the claim

Diamond (1991) shows that new borrowers take initially bank loans but may later issue debt directly, if the positive credit record obtained while monitored generates reputation effects. Therefore, borrowers with higher credit ratings can obtain funding at lower costs from bond issuance, while borrowers with lower credit ratings are subject to bank monitoring. Similarly, according to Holmstrom and Tirole (1997), only firms with sufficiently high net worth would be able to issue bonds, while firms with intermediate capitalisation would have to borrow from intermediaries, and undercapitalised firms would not be able to invest. Rajan (1992) finds a u-shaped relation between investment opportunities and bank borrowing: firms with high-quality projects and those with risky projects will prefer arm's length finance, while firms with medium-risk project will select bank debt. Likewise, in Bolton and Freixas (2000) the financial structure is endogenously determined by the characteristics of the firm and by the level of intermediation costs.

Consistently with these theoretical predictions, Hoshi, Kashyap and Scharfstein (1993) find that firms having ex-ante higher net worth and investment opportunities were more prone to reduce their reliance on bank debt and issue public debt following the deregulation in Japan during the 1980s. Hale and Santos (2008) study the role of a firm's reputation on the timing of its bond IPO and provide evidence supporting Diamond's (1991) theory. Also in Denis and Mihov (2003), public borrowers are larger, more profitable and with higher credit ratings with respect to firms borrowing from banks (or from non-bank private lenders). At the same time, Rauh and Sufi (2010) find that low-credit-quality firms are more likely than high-credit-quality firms to have a multi-tiered capital structure, consisting of both secured bank debt with tight covenants and subordinated non-bank debt with loose covenants. Darmouni and Papoutsi (2020) document the increase in the use of corporate bond financing in the Euro Area, by smaller and riskier firms entering the bond market over the years; at the same time, they show that firms facing a rating downgrade revert to more bank financing.

Focusing on the Italian corporate bond markets, Accornero, Finaldi Russo, Guazzarotti and Nigro (2015) show that, besides reputational aspects, two important drivers of the decision to enter the bond market are the needs to finance growth and to reduce maturity mismatches between assets and liabilities. Iannamorelli, Nobili, Scalia and Zaccaria (2020) distinguish private and public information on firm creditworthiness and find that, holding public information constant, firms with better private

priority. Since a new equity issuance could be interpreted by market investors as a signal of share overvaluation, managers would refuse to issue undervalued shares, as the issuance of new stocks, by diluting the value of the existing equity, would transfer part of the firm's wealth from current to new shareholders.

<sup>&</sup>lt;sup>10</sup> Low-quality firms will prefer arm's length finance rather than bank debt to avoid bank monitoring and the threat of termination.

fundamentals are more likely to access bond markets: therefore, firms use market funding to signal credit quality to external stakeholders. <sup>11</sup>

Our paper contributes also to the literature on the relation between firm capital structure and financing costs. Some empirical studies analyse the effects of changes in capital structure for equity IPOs. Pagano, Panetta and Zingales (1998) analyse the effects of IPOs on lending conditions and corporate performance for a sample of Italian firms, by comparing companies that went public with otherwise identical firms that remained private. They find that firms going public managed to decrease their relative cost of credit, particularly in the case of independent companies, with a reduction in the rate between 30 and 55 basis points; also, independent companies experienced a decrease in the concentration of credit among banks and an increase in the number of banks. Using syndicated loan data for US companies, Schenone (2010) finds that - after an IPO - lending rates decreased particularly for firms with more intense firm-bank relationships. By reducing the information asymmetries for other banks previously not involved in a firm-bank relationship, the IPO worked as an information-releasing event, with the effect of decreasing the cost of switching banks for the new publicly listed firm.

Few other papers analyse the effects of bond issuances, focusing on US firms and using syndicated lending data. Santos and Winton (2008) analyse the pricing of syndicated loans to large firms in the US and provide evidence of the hold-up effect for firms mainly reliant on bank credit versus other firms able to diversify their funding sources via the issuance of corporate bonds. Moreover, the spread paid on loans is higher the longer time passes since the last public bond issuance, thus confirming the informational value of public issuance for the perception of corporate creditworthiness. Consistently, Hale and Santos (2009) show that firms obtain lower interest rates after a bond IPO. At the same time, Schwert (2020) finds that banks maintain a substantial interest rate premium on loans with respect to market financing, even once default risk and covenants are accounted for: this result suggests that either firms place an extra value for bank services that they are willing to pay, or banks maintain a certain degree of information advantage.

Our paper is related also to the literature on benefits and costs of bank lending relationships. Banks gather valuable soft information about the economic prospects of corporations through a

\_

<sup>&</sup>lt;sup>11</sup> Their subsequent paper, which follows our study, is focused on the drivers of the decision of SMEs to issue corporate bonds and it complements our analysis by investigating the role of asymmetric information on corporate funding choices. They first sketch a theoretical model that shows positive selection in corporate bond markets, as firms with better unobservable credit quality strategically opt for capital markets funding. Then they test this hypothesis by estimating the firm level probability of issuing bonds for Italian SMEs, using as main explanatory variable the difference between credit quality as perceived by outside investors (based on accounting data) and that observed by insiders (including also credit history). They find that the issuance of bonds is more common among those firms that are more creditworthy than their financial balance sheet position.

monitoring activity, which contributes to reduce borrowers' moral hazard and which could not be conducted in a cost-effective way by individual creditors (Diamond, 1984). Established firm-bank relationships may bring some benefits to firms, by increasing the credit availability on a long-term basis, potentially also in crisis times (Petersen and Rajan, 1994; Bolton, Freixas, Gambacorta and Mistrulli, 2016). Moreover, firm-bank relationships allow the borrower a certain degree of flexibility, provided that credit lines typically carry a draw-down option (Berg, Saunders and Steffen, 2016; Sufi, 2009).

Yet, the bank acquires information in the course of the firm-bank relationship, which is proprietary and cannot be communicated to other potential lenders. This gives a larger bargaining power to the bank, which may then extract some surplus from the firm's profits (hold-up effect; Rajan, 1992; Sharpe, 1990). Therefore, firm-bank relationships may imply higher costs. In von Thadden (2004) outside lenders implement randomization of offers which limit the rents gained by the inside bank. Some firms will switch banks and obtain lower lending rates from the outside bank. Ioannidou and Ongena (2010) analyse empirically the effects of this switching behaviour, showing that the switching firm is charged by the outside bank lower lending rates than the ones required by the inside bank to ex-ante comparable non-switching firms. This incentive to switch in order to reduce financing costs could hold more widely – depending on the financing options available to firms – also for the choice between bank credit and market-based finance.<sup>12</sup>

The above papers on corporate capital structure and bank lending suggest that the reduction in lending rates after funding diversification may come from two channels: first, the increase in the bargaining power of firms towards the relationship banks may lower the rates charged by inside banks; second, the public release of information previously available only to the relationship banks may incentivise outside banks to offer better credit conditions. The above arguments may hold differently for different types of funding sources: while the bargaining power explanation applies to both new equity and debt issuance, the information release argument depends on the actual amount of information publicly disclosed with the issuance of new securities. In general, public listing requires the disclosure of a significant amount of information, while the release of information could be somehow less significant for the issuance of debt securities. This may occur not only when bonds are privately placed, but also when some prospectus requirements are waived for public issuance, under a regulatory framework aimed to decrease fixed issuance costs, like the minibond reform. Our paper investigates the effects of funding diversification via bond issuance, as induced by a regulatory change designed particularly for small and medium firms.

\_

<sup>&</sup>lt;sup>12</sup> Information monopolies may affect also the choice about the mix of private and public debt claims (Houston and James, 1996)

### 3. Institutional Background and Stylized Facts

The regulatory reform introduced in Italy in 2012 was aimed at encouraging the issuance of corporate bonds by small and medium enterprises, in a context characterised by strong reliance of the corporate sector on bank debt. The reform released some pre-existing regulatory limits to the issuance of corporate debt by unlisted firms and extended the favourable tax regime previously provided only for the debt issuances of listed firms. Cerved Group (2013) estimates that there are about 35,000 Italian companies potentially able to issue minibonds, as they are characterized by an annual turnover of over EUR 5 million and rated as safe or at least financially solvent.

In Italy, corporations heavily depend on the banking system for their funding, although with some relevant differences between large (particularly listed) and small-medium firms. In the recent past, while large corporations could have access to capital markets for the issuance of their bonds, small and medium enterprises could not obtain market-based funding both for economic reasons and for regulatory restrictions.

Among the economic factors, small corporations face significantly higher funding costs on capital markets, due to their opaqueness that increase the informational asymmetries between investors and issuers. Moreover, the recourse to capital markets by Italian SMEs may have been hampered by the limited presence of specialized domestic investors, interested in investing in corporate debt instruments (Accornero, Finaldi Russo, Guazzarotti and Nigro, 2018 and 2015). At the same time, given the national fragmentation of capital markets in the EU, it is unlikely that the debt instruments of Italian SMEs could be purchased by other EU investors.

The need for a larger diffusion of market-based finance for SMEs in Italy and more generally in Europe emerged also as a consequence of the contraction in credit supply by banks during the crisis, particularly for the lending activity to private non-financial corporations. <sup>13</sup> Indeed, the wide reliance of EU corporations – and in particular of SMEs – on bank credit increased the crisis vulnerability of the corporate sector.

<sup>&</sup>lt;sup>13</sup> Becker and Ivashina (2018) argue that the reduction in the credit supply to corporations was also a consequence of a "financial repression" phenomenon in the Euro Area: while national authorities exerted some moral suasion on domestic banks to induce them to increase their holdings of national sovereign debt, banks contracted their credit provision to corporations. Extending the methodology developed in Becker and Ivashina (2014), they find evidence on the cyclicality of bank credit supply based on the financing choices of corporations, which could have used less bank debt and more corporate debt to deal with the contraction in bank credit supply.

The regulatory framework may add further restrictions to the use of market-based funding for SMEs, especially if it provides differential treatment to firms according to their size. Therefore, policy reforms aimed at removing existing regulatory restrictions may contribute significantly to encourage the diversification of corporate funding sources, with potential benefits on financing costs. For this reason, the minibond reform has attracted significant attention in the context of the discussion on the Capital Markets Union in Europe.

# 3.1. The Regulatory Reform and the ExtraMot Pro Platform

The regulatory reform that introduced minibonds in Italy was carried out in several phases. First, in June 2012, the so called "Decreto Sviluppo" (Law Decree 83/2012, converted in the Law 134/2012) removed the pre-existing limits to the issuance of corporate bonds by unlisted firms (other than microenterprises), provided that the securities are negotiated in a regulated market or in a multilateral trading facility. This legislative act also extended to minibonds the same tax treatment established for the bonds issued by listed firms, including tax relief on interest costs and issuance expenditures, and a preferential tax regime for the interest income gained by investors.

Following these regulatory changes, Borsa Italiana (i.e. Milan Stock Exchange, part of the London Stock Exchange until October 2020 and now part of Euronext) created on March 2013 an *ad hoc* multilateral trading facility, called ExtraMot Pro, open only to professional investors and designed to offer to corporations, and particularly to SMEs, a flexible and cost-effective market suitable for minibond issuance and trading.<sup>14</sup>

The listing requirements on ExtraMot Pro are simplified with respect to the MOT market (open also to retail investors). Since this multilateral trading facility is open only to professional investors, the listing procedure is not subject to the EU Prospectus Directive and does not need a prior approval by the financial market supervisory authority (CONSOB). Therefore, the time needed for the listing is substantially reduced: the security is admitted to trade within 7 working days from the completion of the initial submission to Borsa Italiana. The issuer is required to publish an Admission Document<sup>15</sup> and

<sup>&</sup>lt;sup>14</sup> Most recently, from September 2019, Borsa Italiana launched another market segment even more focused on SME bonds, called ExtraMot Pro3, in line with the EU definition of SME Growth Market as set in the MiFID II Directive. ExtraMot Pro3 is focused on the issuance of bonds by unlisted firms, SMEs, and with a nominal issuance amount below EUR 50 million. Therefore, ExtraMot Pro3 has replaced the existing ExtraMot Pro as the dedicated multilateral trading facility for minibonds.

<sup>&</sup>lt;sup>15</sup> Issuers still have the possibility to issue a proper prospectus. However, only firms issuing minibonds of very large size prefer to follow this option.

the audited annual financial statements for the last year. In case a rating (for the firm or the bond issuance) is assigned, the issuer has to disclose it. Listing fee amounts to EUR 2,500.

This simplified listing regime for bonds open to professional investors is designed to strike the appropriate balance between the reduction of expenses for issuers and the provision of adequate investor protection. Still, the issuance of minibonds is subject to various cost items, fully tax deductible, whose overall amount depends on the company features, the complexity of the issuance, and the placement modalities (Observatory Minibond, 2021). Apart from the listing fees, the main costs include: the auditing of the balance sheet, the advisory fees, the arrangement fees, the legal fees, the notary fees (for changes in the company statutes) and the registry fees (with the Chamber of Commerce), the rating fees (for minibonds rated by a rating agency), the fees of the central securities depository.<sup>16</sup>

Further legislative innovations were introduced mostly to expand the investor base of minibonds. In December 2013, the so called "Decreto Destinazione Italia" (Law Decree 145/2013, converted in Law 9/2014) provided for three main changes, all from the investors' side: 1) it established the eligibility of the minibonds as underlying assets for securitization; 2) it included the minibonds in the set of financial instruments suitable to cover the technical reserves of insurance companies; 3) it applied a preferential tax treatment to the interests and capital gains for the minibonds underwritten by dedicated investment funds. Finally, in June 2014, the so called "Decreto Competitivitá" (Law Decree No. 91/2014, converted in Law 116/2014) extended the favorable tax regime on the interests and capital gains to all minibonds not admitted to multilateral trading facilities, as long as they are traded with institutional investors.

#### 3.2. Some Stylized Facts on Minibond Issuances

\_

<sup>&</sup>lt;sup>16</sup> Given the potentially different features of minibond issuances, for the company type, the complexity of the issuance, and the placement modalities, an estimate of the overall issuance cost would be approximate and in any case would be a function of the nominal issuance amount. So, considering the median bond amount in our sample of EUR 7 million, the costs at the time of the issuance (including the listing fees with the Extramot Pro platform) would be included in a range between EUR 91,500 and EUR 301,500 (between 1.3% and 4.3% of the nominal amount). These range estimates are based on surveys among market participants regarding the individual cost components as listed above (Observatory Minibond, 2021). In fact, the required cost for a financial advisor would be between 0.5% and 2% of the nominal issuance amount. The costs for appointing an arranger would be between 0.5% and 1.5% of the nominal issuance amount. The legal fees required for the preparation and the check of documents can vary in a range between EUR 12,000 and EUR 22,000. The registration with Monte Titoli implies an initial cost of around EUR 2,000. For a SME, the annual cost for balance sheet auditing is in a range between EUR 5,000 and EUR 15,000. The provision of a rating (not compulsory for minibonds) has a cost between EUR 5,000 and EUR 15,000 in the first year. After the issuance, some annual fixed costs would be still required for the auditing, the fees of the central securities depository and the (potential) rating.

In the immediate months following the first reform act, the favorable regulatory framework for minibonds was exploited also by relatively large firms, which took the opportunity of the simplified listing procedures to raise funds from public capital markets at cheaper conditions. However, starting from the second half of 2013, medium and small enterprises took the opportunity to issue minibonds (see Figure 1). The legislative acts adopted after 2012 did not change the regulatory framework for issuers, but, providing further advantages for investors, they enhanced the demand for minibonds and could have contributed to reinforce the issuance incentives for small and medium enterprises.

According to the Minibond Observatory (Osservatorio Mini-Bond, 2017), up to the end of 2016, 222 firms issued minibonds, gathering more than EUR 11.5 billion through 292 issuances. Among these firms, 95 are classified as SMEs and they raised debt for an overall amount of EUR 1.28 billion until the end of 2016. For all issuer firms, the average interest rate (generally a fixed coupon) was 5.36 percent, while the average maturity was around 5.7 years.<sup>17</sup>

# 4. Empirical Analysis

#### **4.1. Data**

The dataset used in the empirical analysis is based on the combination of sev eral data sources: security-level data on the minibond issuances by firms; annual firm-level information on corporate balance sheets; and monthly loan-level data on the bank credit amounts and quarterly loan-level data on the lending rates charged by banks to firms.

The data on minibond issuances were mainly collected from the Italian Stock Exchange (Borsa Italiana), since most of the bonds were listed on the ExtraMot Pro Platform (Table 1). Further

<sup>&</sup>lt;sup>17</sup> We present the above stylised facts with regard to the minibond issuances until the end of 2016. Indeed, the introduction of the Market Abuse Regulation (MAR), entered into force in the EU in July 2016, imposed higher information burden on listed financial instruments, including minibonds traded on multilateral trading facilities. Even if the issuance of minibonds progressed, the share of listed minibonds has fallen (Minibond Observatory, 2018, 2019, 2020) while novel channels of issuance became more common, including minibonds fully subscribed by investment funds or by banks. For these reasons, also in the empirical analysis, we define our sample period in a way to avoid the confounding effect of these somehow different developments in the minibond market, but we still consider in the sample those minibond issuances planned in advance and whose pricing and placement took place in 2016 Q3 and Q4 (18 in the population, out of 148, and 10 in the sample, out of 92). More recently, in the context of the Capital Markets Union initiatives, and following the establishment of the SME Growth Markets by the MiFID II, various amendments were introduced to the Market Abuse Regulation and to the Prospectus Regulation. These amendments were set in late 2019, in order to reinforce the attractiveness of market-based funding for SMEs, by reducing the compliance cost and administrative burden and entered fully into force in January 2021 (SME Growth Market Regulation, EU 2019/2115).

information on minibond issuances, not listed in ExtraMot Pro Platform, were collected from other sources.

In order to observe a sufficiently long data series for credit conditions after minibonds issuance, we conduct our analysis considering the securities issued up to 2016. We gathered information about 231 minibonds, issued by 148 firms between October 2012 and December 2016, for an overall amount of EUR 8.9 billions in issuance (Table 1). SMEs account for more than 50 percent of the issuers, but less than one tenth of the outstanding amount, given the relatively smaller size of their issuances (Figure 1). Most of the bonds paid a fixed rate coupon (72 per cent) around 5.8 per cent, on average; therefore, they were more costly than bank credit.

We obtain the balance sheet information for corporations from the Cerved database. <sup>18</sup> Merging the information on bond issuances with the Cerved database, we get balance sheet information on 92 issuers ('Sample' in Table 1) covering the period 2010-2018. The decrease in the number of issuers is due to the exclusion of firms with financial balance sheets (i.e., holding companies of industrial groups) or without balance sheet data. Cerved also provides Z-scores (Altman, 1968) for most of the firms, as well as information on their economic activity and headquarters. Data show that issuer companies were concentrated in manufacturing and services, were based in the North of Italy and were mainly medium-or large-sized firms according to their total assets (Table 2).

We use quarterly data on bank loans, both for the amounts of credit granted and credit used and for the interest rates charged by banks in the individual firm-bank relationships. Data on bank credit come from the Bank of Italy's Central Credit Register (CR, Centrale dei Rischi). CR covers the population of loans above the threshold of EUR 30,000. For each loan, the database provides information on the lender and borrower identity, the type of credit (credit lines, advances, long-term loans) and the maturity. Data on lending rates charged by banks come from the Bank of Italy's Interest Rate Database (TAXIA). TAXIA includes all the interest rates charged by a sample of more than 200 banks, out of around 600 banks operating in Italy, together with the information about the lender and borrower identity, the type of credit (credit lines, advances, long-term loans) and the maturity. Short-term interest rates (credit lines and advances) refer to all the outstanding positions at a certain point in time, while long-term loans refer to new loans granted in the previous quarter only.

Based on the loan-level data on interest rates, one year before the first issuance, the issuer firms included in the sample displayed an average cost of overall bank debt equal to 4.9%, with some

<sup>&</sup>lt;sup>18</sup> Cerved is a leading information provider in Italy and one of the major rating agencies in Europe. Its database collects the balance sheets of all the Italian corporations since 1982 and a sample of partnerships since 2005.

heterogeneity across different types of bank loans (for instance, 5% on new long-term loans, having a maturity similar to the one of debt securities). While the average coupon rate for the minibonds issued by these firms was on average 6%. The latter means a spread of about 100 basis points compared with the average interest rate charged on new long-term loans to these firms (see Table 3).

#### 4.2. Identification Strategy

The introduction of the minibond reform in Italy provides a striking deregulation experiment to study the effects of the diversification of funding sources on the financing conditions for corporations. This applies in particular to small and medium enterprises, and more generally to unlisted firms, given that they have been designated as the key beneficiaries of this policy measure. The discussed regulatory changes – by removing the previous restrictions to the issuance of corporate bonds by unlisted firms – opened a new funding opportunity alternative to the traditional bank credit provision. We exploit this innovation to analyse the impact of bond issuance on credit conditions and volumes for the issuer firms, compared with a counterfactual sample of non-issuer firms (that are otherwise similar to the issuers).

We define the ex-ante and the ex-post outcomes with respect to the first minibond issuance: given that the issuance is the event allowing for funding diversification, even if some firms have undertaken more than one issuance over time, the first issuance conveys the very first message to banks that a given firm can obtain finance also from capital markets.

Among all the unlisted firms potentially eligible according to the new regulatory framework, only a few corporations have actually issued and listed minibonds in the ExtraMot Pro platform (or in other multilateral trading facilities). This can be due to several reasons, in particular to firms' characteristics and financial conditions prior to the issuance. Therefore, when defining the sample of control firms, we cannot consider the universe of eligible firms, but we need to construct a counterfactual sample of exante comparable corporations.

Information barriers may have played also some role, by affecting and/or limiting the diffusion of news about the additional funding opportunity across firms. Given the limited experience of unlisted firms with capital market developments, eligible firms could have gained awareness about the new funding alternative in different periods. Given the limited contacts of unlisted firms with investment

banks, the main bank with which the firm has a long-lasting credit relationship may have then contributed to inform the firm, advising it in favor of or discouraging it from the issuance of minibonds<sup>19</sup>.

We allow the selection of issuer versus non-issuer firms to be driven by firm-level characteristics rather than by a purely random assignment. Firms decide whether to issue minibonds on the basis of their existing financial conditions as well as of their forward-looking growth perspectives. This self-selection could have implications for our impact evaluation, if these firm-level features – influencing the probability of the issuance – were correlated with the outcome variables.

We deal with this issue by implementing an exact matching procedure based on ex-ante firm-level characteristics and restricting the analysis to comparable groups of issuers and non-issuers in a way consistent with the unconfoundness assumption. This methodology extends the empirical approach developed by Ioannidou and Ongena (2010) for the switching across banks.<sup>20</sup> We study the switching behavior from bank credit to debt funding: we consider firms initially taking funds only from banks and then expanding their funding sources with corporate bond issuances. Since the loan offer to a treated firm in the case of non-issuance would not be observable, we compare the loans granted to issuer firms with the loans granted at the same time to non-issuer firms – having the corresponding pre-determined characteristics in the pre-issuance time.

To identify the proper control sample, we consider some observable firm-level features – measured before the first issuance – which can be relevant for credit conditions and volumes, like the geographical area, economic activity, total assets, the leverage ratio, and the Z-score. Moreover, since we admit that the main bank could have played an important role in informing and advising firms about the possibility to issue minibonds, in selecting the control sample we include also the identity of the main bank among the matching criteria. We also take into account the fact that minibonds were issued in different time periods, so we conduct the exact matching in relation to firm characteristics in the year before the first issuance per each issuer firm. Once we control ex-ante – in the definition of treatment and control samples – for these firm-level characteristics, and conditional on them, treatment and outcomes can be assumed to be independent. In this way, we can attribute post-issuance changes in

-

<sup>&</sup>lt;sup>19</sup> The proximity to the headquarters of the Stock Exchange, and more generally to a financial center, may also explain the probability that a firm is informed about this alternative funding opportunity: we account for this in the robustness checks for firm location, as discussed in Section 7.2.

<sup>&</sup>lt;sup>20</sup> They investigate whether outside banks offer better credit conditions than insider banks to the switching firms. To this aim, firstly they compare the interest rates charged by the outside bank on the new loans to the switching firm with the rates on existing loans from the inside bank to ex-ante comparable non-switching firms. Secondly, they explore whether the outside bank treats its new borrowers better than its existing ones, by matching – for the outside bank – the new loans to the switching firms with the existing loans to ex-ante comparable non-switching firms.

credit conditions to the minibond issuances rather than to other firm-specific factors, which could operate anyway, also in absence of debt issuances.

The large size and the wide heterogeneity of the population of eligible firms allow us to fulfill the overlap assumption, i.e., we are able to find – for any setting of the covariates – units in both the treatment and the control groups. The relatively contained number of issuer firms, when compared with the significantly larger universe of eligible firms, puts us in the condition to conduct a very selective exact matching procedure.

### 4.3. Control Sample

We identify the control sample of ex-ante comparable non-issuer firms based on the exact matching for firm-level characteristics observed in the year before the first minibond issuance. As a pool of potential controls, we first consider all the Italian firms with turnover and total assets of at least EUR 2 Million in 2014 (as among issuer firms) and reporting balance sheet information in Amadeus-Bureau van Dijk database (around 35,000 firms). Within this sample we define the control group by matching firms' characteristics in the year before the first issuance (from 2011 to 2015, depending on the treated firm) and the identity of the main bank. To reasonably limit the number of matching cells, we apply a Coarsened Exact Matching (CEM), i.e. we discretize our continuous variables. The CEM is designed to reduce the imbalance between the treated and control groups, hence reducing bias and model dependence (Iacus, King and Porro, 2011). Since the treatment (i.e., the first minibond issuance) occurs at different time for each firm, we apply the CEM procedure for each year and assign to each control firm the same time of event of the matched treated firm. Among pre-treatment characteristics, we consider:

- 1. At least one bank loan in the pre-treatment year (all the treated fulfill the requirement), without any bond issuance.
- 2. Firm credit risk (two classes): low risk, Z-score between 1 and 4; medium and high risk, Z-score between 5 and 9.
- 3. Leverage ratio (two classes): up to 50 percent; higher than 50 percent

 $<sup>^{21}</sup>$  The exact matching is conducted (with replacement) for each year. We consider the subsample of issuer firms having their first issuance in a given year and we execute the matching on the full sample of potential controls, to identify – per each issuer firm – a sample of control firms. The CEM weights ensure that the parametric analysis reflects the actual observations.

- 4. Total assets (three classes):<sup>22</sup> lower than 10 million; 10 to 43 million; greater than 43 million.
- 5. Economic activity (five classes): 1. agriculture and fishing; 2. manufacturing industries; 3. non-manufacturing industries (mining, electricity, gas); 4. construction; 5. service industries.
- 6. Firm location (three areas): North, Center, South.
- 7. Identity of the main bank for each firm: the main lender bank is defined as the major creditor of the firm, in terms of total credit used, in the year before issuing the minibond. We have 33 different main banks in our sample of treated firms.

We are able to match 92 treated firms with 2,666 control firms (Table 2). On average we have 29 controls for each treated, but the distribution of the number of matched control firms is positively skewed and most of the issuers have far less controls, being the median 8.75 (see Table A.1 for more details).<sup>23</sup> For robustness checks, a coarsened exact matching with even more stringent criteria can be implemented, but at the cost of somehow reducing the number of issuer firms for which we can match control firms.

By construction, treated and matched control firms display the same distribution for all the variables considered in the Coarsened Exact Matching. The differences between the treated firms and the matched control firms are now negligible as far as economic activity, location, size, Z-score and leverage ratios are concerned, whereas they are quite sizable when compared with the unmatched control firms. As for other balance-sheet indicators, in the period before the introduction of minibonds (corresponding to the years 2010-2012), issuer firms display slightly higher profitability and cost of debt. The share of fixed assets over total assets is similar across treated and control firms, but the growth rate of tangible fixed assets is much higher for treated firms.

For robustness, we conducted also a more stringent coarsened exact matching, introducing more selective criteria for controls.<sup>24</sup> Even though we drop some treated firms and many control firms, the estimates confirm our results in both direction and magnitude. In alternative to the exact matching, we also implemented a propensity score matching using the same selection variables and the estimation results confirm the outcomes based on the coarsened exact matching.<sup>25</sup>

<sup>&</sup>lt;sup>22</sup> The three classes for total assets reflect the EU classification of firms in small, medium and large.

<sup>&</sup>lt;sup>23</sup> Many issuer firms have few matched firms: for instance, 11 treated firms have only one matched firm and 10 issuer firms have two matched firms.

<sup>&</sup>lt;sup>24</sup> In particular, we consider 3 different classes in the leverage ratio and three different Z-score levels, matching 84 treated firms with around 1500 controls. The results of this estimation are available on request.

<sup>&</sup>lt;sup>25</sup> See Section 7.3 for a brief discussion of the estimations based on propensity score matching. Methodology and results are depicted in Appendix D.

Once we identify – per each issuer firm – a restricted sample of ex-ante comparable firms, we can investigate the effects of the minibond issuances on the credit conditions for issuer firms versus eligible non-issuer firms. We consider the evolution of the firm-bank lending relationships both in terms of credit rates charged by banks to the individual firms, and in terms of volumes of credit used and credit granted.

Table 3 presents some descriptive statistics on interest rates, bank loans and financial debt for issuer and control firms. Consistently with the empirical analysis (see Section 4.4), we consider the two quarters before the first minibond issuance (before) against the quarter of the first issuance and the following two quarters (after).

Panel 1 displays the average borrowing rates on different types of banks loans, on the overall amount of bank loans and on total financial debt. Advances and long-term loans represent jointly a share of more than 90% of credit used for both issuer and control firms. After the issuance, the pre-existing differences in lending rates between issuer and control firms are significantly reduced for advances and long-term loans, as issuer firms display a stronger decrease in their average lending rates than control firms.<sup>26</sup> We compute also a weighted average bank lending rate for firms, including all types of bank debt contracts. Also the weighted average interest rates on total bank loans decrease more for issuer than for matched control firms.

Panel 2 presents data on the use of bank debt and the lending relationships. After the issuance, a relevant easing in credit constraints for bank debt is observed for issuer firms: the used share of granted credit decrease substantially for issuer firms, while remaining unchanged for control firms.

Panel 3 displays the amounts of different components of financial debt expressed as percentages of total assets. After the issuance, issuer firms reduce the amount of credit used, while increasing significantly the amount of their financial debt thanks to the minibond issuance.<sup>27</sup>

While the descriptive statistics on the changes in financial conditions after the first issuance between the two groups of issuer and matched control firms point to the expected direction, yet these differences in means are rarely statistical significant without the proper econometric specification.

#### 4.4. Difference-in-Differences Specification and Hypothesis Testing

<sup>&</sup>lt;sup>26</sup> We compute also the differences in means of each variable comparing the two quarters before with the issuance quarter and the following two quarters, and conduct a two-sample t-test for the statistical significance of the differences-in-means.

<sup>&</sup>lt;sup>27</sup> This is observed also when classifying the overall sample of firms depending on their size (small, medium and large firms. Descriptive statistics classified by size of firms available on request.

Based on the exact matching procedure for issuer firms and ex-ante comparable non-issuer firms, we use a difference-in-differences (DID) empirical setting to estimate the changes in lending rates and loan volumes after the first issuance of minibonds.

The main dependent variables are: a) the interest rates charged in the individual firm-bank relationships, classified by different types of loans, i.e. credit lines, advances and new long-term loans; b) the amounts of granted and used loans, as well as the ratio between credit used and credit granted in firm-bank relationships, estimated both for the overall credit volume and for different types of loans.

The analyses on the first set of dependent variables explore the question whether bond issuances allow corporations to obtain from banks lower lending rates than ex-ante comparable non-issuer firms. The outcome is not obvious. On the one hand, the diversification of funding sources – while reducing the reliance of issuer firms on bank credit – may improve their bargaining power in the firm-bank relationship and eventually lead to better loan conditions. On the other hand, if the market rates required by investors are higher than the bank rates – as it is usually the case for the first issuances of minibonds – banks may have lower incentives to ease lending conditions since the bond market would not be a more attractive source of funding than bank debt. Therefore, no changes in bank lending rates might be observed.

With the second set of dependent variables, we examine whether the issuances of minibonds affected either the volume of credit granted by the banks or the amount actually used by the firm.

The impact of minibonds on *credit used* would crucially depend on the purpose of the issuance, given that the amount of used credit is chosen by the borrower firm as a function of demand factors. If the firm has issued minibonds in order to change the composition of its funding sources, i.e., to substitute bank credit with capital market financing, then we can expect a decrease in the used amounts after the issuance. If the firm plans to start a new project requiring additional funding, the minibond issuance can be used to complement bank credit with capital market financing, then we can expect that the used amount of bank credit would not be subject to significant changes.

The impact of minibonds on *credit granted* might reflect supply decisions, which can be either bank- or firm-specific. The bank can modify the granted amounts either for a change in its general lending policy (for example due to tightening or loosening balance sheet constraints) or for some firm-specific reasons (for instance upcoming concerns about the firm's creditworthiness or positive news about the firm's profitability). Given that generalized changes to the granted amounts for all firms would be captured by the bank and time fixed effects, the effect of the minibond issuance for the treated firms

can be observed if the bank takes the opportunity of the debt issuance to reduce its exposure to the firm, or decides to increase or decrease the granted credit based on the assessment of firm creditworthiness.

Our main specification exploits panel data at the level of individual firm-bank relationships, therefore our outcomes are the interest rates and the loan amounts in each period and for each firm-bank credit relationship.

We conduct a difference-in-differences analysis, and define the treatment as whether the firm i has issued minibonds (minibond = 1) or not (minibond = 0). The treatment dummy 'minibond' is also interacted with the dummy 'post', equal to 1 after the first issuance:

(1) 
$$Y_{i,j,t} = \alpha_i + \delta_j + \gamma_t + \beta_1 post_{i,t} * minibond_i + Z Controls_{i,t-4} + \epsilon_{i,j,t}$$

We control for firm  $(\alpha_i)$ , bank  $(\delta_j)$ , and year  $(\gamma_t)$  fixed effects. The coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) measures the average treatment effect of the first issuance on interest rates and volumes of credit. <sup>28</sup> Among the controls, as additional covariates, we consider some firm characteristics: total assets (in logs), leverage, Z-score. All the covariates are measured with a one-year lag. Regressions are weighted with CEM strata weights and standard errors are clustered at the firm level. The effect of the minibond issuance is measured in the quarter of the first issuance and in the following two quarters, compared to the two quarters before the event. Data on the matched control firms cover the same period as the treated firms. As robustness check, we conduct the estimation also on a longer sample including six quarters after the issuance and the results are confirmed.

The difference-in-differences approach requires the common trend assumption to be validated, i.e. the outcomes of treated and control firms should follow the same trend in absence of treatment. To check this assumption, we display graphically the dynamics of interest rates, for different categories of loans, and of the share of credit used in the pre-treatment period.

We need to take into account that the treatment (i.e., the first minibond issuance) occurs at different time for each firm, in a period between October 2012 and December 2016. Given that different issuance times were also characterized by different conditions in interest rates and financing costs, we compare the trends in lending rates and volumes by normalizing the levels just before the time of the first issuance (i.e. at the end of the quarter preceding the issuance).

<sup>&</sup>lt;sup>28</sup> We started from a standard specification of the type:

 $Y_{i,j,t} = \alpha + \delta_j + \beta_1 post_{i,t} * minibond_i + \beta_2 post_{i,t} + \beta_3 minibond_i + Z Controls_{i,t-4} + \epsilon_{i,j,t}$ . Since we introduced firm  $(\alpha_i)$  and year  $(\gamma_t)$  fixed effects, the two dummies 'minibond' and 'post' are dropped, because of collinearity.

The charts (Figure 2) depict the trends for issuer firms and controls from four quarters before the treatment to six quarters after. Interest rates (by categories of loans) and the share of used credit show similar trends until the time of the issuance event (tevent = 0), with the only exception of the lending rates rate on credit lines.<sup>29</sup> In the period following the minibond issuance, the effect on interest rates is noticeable for advances and long-term debt and it tends to strengthen through time. On the contrary, the impact on the share of used credit used is immediate and it stabilizes afterwards, pointing to a reimbursement of part of the outstanding loans as a consequence of the market-based finance.

# 5. Firm-bank Level Analysis

In the main specification, we conduct our analysis at the firm-bank level to investigate the effects of the first minibond issuance on the lending rates charged by banks to issuer firms and on the volumes of credit granted by banks and used by firms. Having data at the firm-bank level in every period, we can control for firm, bank and year fixed effects.

#### 5.1. Empirical Results: Post-Issuance Lending Rates and Volumes

Table 4 presents the estimates for the impact on lending rates. The coefficient of interest ( $\beta_2$ ) is negative and significant for advances and long-term loans: after the first minibond issuance, issuer firms obtained a reduction in the lending rates charged by banks on the above categories of loans. In particular, if we look at the specifications with all the control variables (col. 2, 4 and 6), the interest rates lower by around 30 basis points on advances, 28 basis points on long-term debt; on the other hand, the effect on credit lines is not significant.

The decrease in lending rates following the diversification of funding sources can be explained by an increase in the bargaining power of issuer firms and the release of new public information about them. Both arguments could be relevant. The features of the issuance treatment and the design of the minibond reform would however suggest a stronger focus on the bargaining power of issuer firms. The minibond initiative has been introduced to incentivize the issuance of debt instruments by SMEs by minimizing the fixed cost of issuance, then, provided that only professional investors are supposed to purchase these securities, the listing procedures are simplified and the disclosure requirements are less stringent than for standard corporate bonds. Therefore, the first minibond issuance by a company may

<sup>&</sup>lt;sup>29</sup> We shall take into account that the lending rates for credit lines are computed on the basis of the outstanding stocks and not of the lending flows.

have a relatively limited information-release effect, but it conveys a strong public signal about its ability to obtain capital markets funding (which is indeed important to explain ex-post its bargaining power with banks). This result holds true even if interest rates on minibonds are typically higher than interest rates on bank credit.

Table 5 reports the estimates of the effects on the amounts of credit granted and used, for the overall credit provision without distinction across types of loan contracts. The results show a reduction in the amount of credit used – at the firm-bank level - by 63 percent after the first minibond issuance. The decrease in credit granted is sensibly lower in terms of magnitude – 11 percent – and is not significant. This reflects the different approach of borrower firms and lender banks after the minibond issuances: while issuer firms replaced bank debt with corporate debt and therefore reduced the amount of bank credit, lender banks were overall still willing to grant credit to these firms and then did not decreased the volumes of credit granted or to a lesser extent. Resulting from these two effects, the ratio between credit used and granted fell by 11 percentage points after the first minibond issuance. The short-term impact on bank credit volumes is then statistically and economically significant.

The reduction in the amount of credit used can be also interpreted as an automatic consequence of the new funds now available to the firm from capital markets. In principle, there could be some heterogeneity across firms in relation to their financing choices, based on the investment opportunities available at the time of the issuance. While most firms did reduce the amount of credit used to a relevant extent for a substitution across funding sources, a few firms could have used the funding provided by minibond issuances to finance new investment opportunities. In the period under consideration for the issuances, the sovereign debt crisis had strong, negative effects on both economic performance and credit supply, and bond finance could have provided an additional amount of external finance. We will come back to this point in section 6.

Table 6 displays the regression coefficients for the analysis on the used amounts of specific categories of loans. The reduction effect observed on the overall credit used in Table 5 is confirmed also when we consider separately the different types of loans, though with some differences. The reduction in credit used is larger for credit lines (by 56 percent) than for long-term-loans (by 47 percent). This suggests also that minibond issuances may have incentivized a change in the maturity composition of the outstanding bank debt in favor of long-term maturities.

Tables 4, 5 and 6 report estimates on the short time period (from two quarters before up to two quarters after the first minibond issuance). These effects are observed to be persistent over time, also

when we estimate the same difference-in-differences regression with an ex-post period including six quarters after the first issuance (Table 7).

Over the longer period, issuer firms obtained – after the first issuance – a reduction in the lending rates on advances by 36 basis points and on long-term loans by 32 basis points, pointing to a slightly larger effect in terms of economic magnitude. This suggests that the benefits of this funding diversification are not purely temporary.

When looking at the lending volumes at the firm-bank level, issuer firms reduced the amount of used bank credit by 59%, while there is no significant variation in the amount of credit granted and the ratio between credit used and credit granted decreased by around 10 percentage points after the first issuance. Therefore, the partial substitution between bank loans and debt issuances is confirmed also in a longer-time horizon, and this occurs even if interest rates on minibonds may be sometimes higher than interest rates on bank loans.

#### 5.2. Empirical Results: Lending from Insider and Outsider Banks

The above analysis shows that issuer firms obtain better credit conditions than ex-ante comparable non-issuer firms. The firm-bank level dimension of this study allows to further explore the potential heterogeneity across banks in their decisions on lending rates. In fact, various incentives may affect the setting of lending rates by banks, including the interest of outsider banks in attracting new and creditworthy firms. Indeed, established evidence in the literature across various credit markets shows that outside banks apply significantly lower rates on comparable new loans than the firm's current inside banks (Ioannidou and Ongena, 2010; Barone, Felici, and Pagnini, 2011; Stein, 2015; Bonfim, Nogueira, and Ongena, 2021). For instance, for Italy, Barone, Felici, and Pagnini (2011) analyze switching costs in local credit markets and find that the rate discount for new versus old borrowers is about 44 bps. In principle, this incentive for outside banks could be even stronger if a firm, thanks to its first-time bond issuance, has shown its ability to get funding from capital market investors.

We investigate whether the interest rate reduction after the first minibond issuance may be different in magnitude between insiders and outsiders. We define as insiders all the banks having a lending relationship with the firm in the 12 months prior to the (first) minibond issuance; while we classify as outsiders all the banks which have not provided credit to the firm in the 12 months before the

<sup>&</sup>lt;sup>30</sup> The evidence presented in these papers is available for the credit markets of, respectively, Bolivia, Italy, Germany and Portugal.

issuance but which extend credit to that firm in the issuance quarter or in the following two quarters. This classification applies correspondingly to the non-issuer firms included in the control sample.

This analysis is relevant also to shed some light on the potential channels driving the improvement in credit conditions for first-time issuers. The intuition would suggest that the bargaining power argument might apply mainly to inside banks, which already know the firm thanks to the existing lending relationships, whereas the information release argument may be more relevant for outside banks potentially interested in providing credit to the issuer firm.

In the end, our specification controls for two types of classification: on the borrower's side, between issuer and non-issuer firms; on the lender's side, between inside and outside banks. We apply a difference-in-differences analysis for treated and untreated firms, in lending relationships with both inside and outside banks, by estimating the following regression equation:

(2) 
$$Y_{i,j,t} = \alpha_i + \delta_j + \gamma_t + \beta_1 Minibond_i * Post_{i,t} + \beta_2 Minibond_i * Post_{i,t} * Outsider_{i,j,t}$$
  
  $+ \beta_3 Minibond_i * Outsider_{i,j,t} + \beta_4 Post_{i,t} * Outsider_{i,j,t} + \beta_5 Outsider_{i,j,t}$   
  $+ Z Controls_{i,t-4} + \varepsilon_{i,i,t}$ 

Our estimates of (2) can disentangle the effect of the (first) minibond issuance on the lending rates charged to issuer firms by insider and outsider banks. We are mainly interested in the coefficients of the double interaction  $\beta_1$ , measuring the change in lending rate for issuer firms after the first minibond, and of the triple interaction  $\beta_2$ , estimating the variation in the post-issuance rate in the lending relationships with outsider banks. The coefficient of the triple interaction assesses whether the effect of the first minibond issuance on the lending rate is different in the new lending relationships with an outsider bank with respect to an insider bank.

Since outsider banks do not have a lending relationship with the firms in the pre-treatment period, we do not know the interest rate that they would have charged at that time. To construct a counterfactual interest rate for outsider banks before the treatment, we fill the pre-treatment lending rate with the average lending rate by insider banks to that firm before the issuance. This reflects the actual credit conditions obtained by the firm before the treatment. We follow the same approach also for the control firms identified via the exact matching. In this way, we analyze the actual changes in the credit conditions charged to issuer firms by insider and outsider banks, assuming the same pre-issuance rate as starting level; therefore the estimated effect depends only on the post-issuance rates by insiders and outsiders.

Table 8 displays the results of this diff-in-diff-in-diff analysis for different types of loan contracts and for different estimation periods. As before, the post-issuance period includes either the quarter of

the issuance and the two following quarters (Col. 1-3) or a longer estimation period considering the quarter of the issuance and the following six quarters (Col. 4-6).

As for the estimation in Table 4, the minibond effects are significant for advances and long-term loans: after the first issuance, issuer firms obtain a rate reduction by 27 bps on advances (Col. 2) and 24 bps on long-term loans (Col. 3). The coefficient on the triple interaction is negative but not significant: this suggests that the effect of the first minibond issuance on the lending rates to issuer firms would not statistically differ in the lending relationships with outsider banks. Therefore, the post-treatment reduction in lending rates for issuer firms does not seem to be driven by the lending conditions charged by outside banks. In line with the limited disclosure from minibond issuances, this result tends to exclude that the potential information release may have a relevant role in explaining the reduction in lending rates after the first issuance.<sup>31</sup> This does not exclude that outsider banks may have incentives to offer more favorable lending conditions in order to start new lending relationships. Consistently with existing evidence for Italy (Barone, Felici and Pagnini, 2011), in our sample firms obtain a rate reduction by 36 bps on long-term loans by outsider banks after starting a new lending relationship (see the coefficient for the double interaction Outsider\*Post in Col. 3).<sup>32</sup>

These results are confirmed also when we consider the longer estimation period, with a rate reduction by 34 bps on advances and by 27 bps on long-term loans, yet without a significant difference between insider and outsider banks (the coefficient for the triple interaction is still not significant).

# 6. Firm-level Analysis

In this section, we analyze the financial and real effects of minibond issuances at the firm level, by investigating both the impact on some credit variables including lending rates and volumes, and the outcome on some firm performance measures and balance sheet indicators. In particular, we explore whether, and to what extent, minibond issuances may have contributed to an overall improvement in the financing conditions of issuer firms with banks and whether this may have produced some effects on the performance of these firms.

<sup>&</sup>lt;sup>31</sup> To further investigate the potential role of information release in relation to the amount of public disclosure, we estimate equation (2) for two subsamples of firms, depending on whether issuer firms used a standard prospectus vs. no or simplified prospectus. Even if this prospectus indication is available only for a subset of minibond issuances, we find similar rate reduction on long-term loans in the two subsamples, and a stronger rate decrease only on advances for firms using a standard prospectus (then disclosing more information).

<sup>&</sup>lt;sup>32</sup> In fact, when interpreting these results on insider and outsider banks, we need to consider that – given the traditional multiplicity of lending relationships in the Italian credit market – most loans are provided by existing banks and that the loans from new banks represent only a small part of the overall bank debt of the firm.

#### 6.1. Bank Debt: Lending Rates and Volumes

In the analysis of bank debt and financial conditions, we move the focus from the individual firmbank lending relationships (as in the previous section) to the overall bank debt received by a firm. We address two main points: first, whether issuer firms – after the first issuance – observed a change in their average cost of bank funding vis-à-vis ex-ante comparable non-issuer firms; second, whether – after the first issuance – issuer firms changed the overall amount of used bank credit or got a variation in the overall amount of credit granted by banks.

In this way, we want to test whether the results of the analysis for individual firm-bank relationships hold in general also at the firm-level: i.e., that firms exploiting the opportunity to issue minibonds not only reduced their overall reliance on bank credit, but also managed to pay lower financing costs on that credit. This would be very important in a policy perspective to assess the effectiveness of the minibond reform. In addition, we explore the potential heterogeneity across firms and we investigate how these effects are observed for different firms, depending on the relative size of the minibond issuance and of the strength of the hold-up by banks.

In this analysis, the dependent variables are: the (weighted) average interest rate paid by a firm on bank loans, also for different types of debt contracts, where the rates paid on individual loans are weighted on the basis on their nominal amounts; the overall amount of bank credit used by a firm or granted to it by all banks. We also analyze the overall amount of financial debt these firms can resort to, considering the used amount of bank debt, the debt provided by other financial intermediaries and the amounts raised with minibond issuances.

Based on the described matching procedure, we conduct a difference-in-differences analysis using the following specification at the firm-level:

(3) 
$$Y_{i,t} = \alpha_i + \gamma_t + \beta_1 \text{ post}_{i,t} * \text{minibond}_i + Z \text{ Controls}_{i,t-4} + \varepsilon_{i,t}$$

The variables used in this specification, both for the treatment dummy (*minibond*) and for the firm controls, are defined as in the estimation at the firm-bank level. In this specification we use firm  $(\alpha_i)$  and year  $(\gamma_t)$  fixed effects. Tables 9 to 12 present the results for the firm-level analysis on credit outcomes: the main effects observed at the firm-bank level are confirmed.

Table 9 displays the results for the lending rates, by categories of loans. As for the firm-bank analysis (Table 4), the coefficients are significant for advances and long-term loans. Following the first minibond, issuer firms obtained overall a decrease in their funding costs through bank advances by 27 basis points and through long-term loans by 40 basis points, based on the specification with the control

variables. The sizeable reduction in interest rates for long-term loans, also larger than the one observed in the firm-bank level analysis, confirms that the recourse to capital markets allowed issuer firms to reduce their funding costs particularly for the financing of long-term projects.<sup>33</sup> At the firm level, we consider also the weighted average lending rates for all bank debt, including all categories of loans.<sup>34</sup> Moreover, to analyze the overall funding costs for firms, we use as a dependent variable also the weighted average interest rate on financial debt as a whole: this is computed as the weighted average of the lending rates on bank loans and of the coupon rates on corporate bonds, considering all the issuances instead of only the first one. Our results confirm the decrease in the cost of bank loans, albeit the estimates are less precise than those by categories of loans. Overall, this reduction in bank lending rates for issuer firms seems to balance the higher cost of minibond issuances. The result of these two counteracting drivers is a negligible impact of minibond issuances on the cost of the total financial debt, which does not differ significantly across treated firms and controls.<sup>35</sup>

The above results at the firm-level are observed to be persistent over time also when we estimate equation (3) over a longer post-issuance period, up to six quarters following the issuance (Table 10). Issuer firms obtained – in the six quarters after the first minibond – a reduction in their average cost of bank debt by 35 bps on advances and by 47 bps on long-term loans. Provided that long-term loans account for around two thirds of the overall bank debt and that this share increases after the minibond issuances (see Table 3), issuer firms benefited from a decrease in their average funding costs via bank debt of around 40 bps (estimate for the weighted average interest rates on bank loans). Again, the overall cost of external fund does not change significantly after the issuance for treated against controls firms, suggesting that the reduction in the cost of bank credit compensates the higher cost of minibonds.

Table 11 reports the coefficients of the firm-level regressions on credit volumes. As in the firm-bank level analysis (Table 5), after the first minibond issuance, issuer firms reduced significantly the amount of used bank credit (by 36 percent) while lender banks decreased only slightly the amount of credit granted to issuer firms (the reduction, around 10 percent, is not significant). As a combination of these two effects, issuer firms decreased the share of used credit by around 11 percentage points. This

<sup>33</sup> Hale and Santos (2009) find that firms entering the public bond market with an investment grade bond benefit from a reduction of 35 to 50 bps in the credit spreads on their loans, while firms issuing a non-investment grade bond obtain a reduction of 5 to 20 bps.

<sup>&</sup>lt;sup>34</sup> For completeness, it is useful to report that the interest rates on distinct categories of loans are computed differently: while the lending rates on long-term loans are computed on the new flows of loans initiated in the post-treatment period, the lending rates on advances and credit lines are calculated based on the outstanding amount of these loans in the same period.

<sup>&</sup>lt;sup>35</sup> However, these results on the overall financing costs have to be interpreted jointly with the results on the overall amount of financial debt, as discussed in Table 11, particularly in light of the increase in the total financial debt.

confirms that issuer firms took the opportunity of the minibond issuance to reduce their reliance on bank credit, even if banks were still willing to provide credit to them.

To analyze the overall debt position of issuer firms, we add other financial debts and the amounts raised with minibond issuances to the overall credit used (Columns 7 and 8). As before, in this case we consider all the issuances instead of only the first one. Our estimates show an increase by around 40 percent in the volume of outstanding debt. We obtain consistent results also when we normalize the amount of financial debt by firms' total assets: after the first minibond, issuer firms reduced this ratio by 10 percentage points. This significant increase in the total financial debt used by firms, associated with no significant change in the overall funding cost<sup>36</sup>, suggests that minibonds provided issuer firms with the opportunity to raise a sizeable amount of additional funds without incurring in higher financing costs. It is doubtful whether these firms could have reached the same result only relying on bank debt, both for the difficulties in increasing bank loans to such an extent in a short-time horizon, and for the likely implications of a significant increase in firm leverage on the pricing of bank debt.

Again, also the increase in the amount of available funds and the change in the debt composition of issuer firms appear to be persistent over time. In the six quarters after the first issuance (Table 12), issuer firms reduced the amount of credit used by 35%, while banks decreased the amount of credit granted to the issuer firms by 10%. As a combination of these two effects, the ratio between credit used and credit granted fell by around 10 percentage points in the six quarters after the issuance, suggesting some release in the credit constraints for issuer firms. At the same time, these firms increased their overall amount of financial debt by 39%.

We explore the heterogeneity of these effects along two dimensions: the relative size of the minibond issuance and the strength of the hold-up by banks. First, we investigate whether the credit substitution due to the minibond size may explain some differences across firms: we compute the ratio of the minibond issuance amount to the total amount of financial debt used by the firm (the latter as an average of the two quarters before the first issuance) and we divide the sample of first-time issuer firms across the median of this ratio.<sup>37</sup> Table 13 shows the results of the regressions for firms below or above this median. When the ratio is above the median, i.e., for firms issuing a relatively larger minibond amount, we observe stronger credit substitution (with a reduction in credit used by 64%) and wider release in credit constraints (with a decrease in the ratio of used to granted credit by 17 p.p.). The larger reduction in credit used, and therefore in banks' loan exposures, contributed to improve the assessment

<sup>&</sup>lt;sup>36</sup> See the results in Table 9 col. 9-10 for the changes in the overall financing costs of issuer firms.

<sup>&</sup>lt;sup>37</sup> The ratio of the minibond issuance amount to total financial debt has a median, in percentage points, equal to 34.3%.

of credit risk for these issuer firms and to apply more favourable lending conditions to them, as lending rates decreased by 47 bps for advances and by 52 bps for long-term loans. On the other hand, for the subsample of firms issuing smaller minibond amounts, we don't find evidence of credit substitution and correspondingly of reduction in lending rates.

Second, we study whether the strength of the existing lending relationships may explain some differences in the effects of the first minibond issuances. For this purpose, we focus on the relationship with the main bank and we exploit the differences across firms in their reliance on that for credit provision. We compute the ratio of the used credit from the main bank to the total used bank credit and split the overall sample in two subsamples, below and above the median of this ratio. Results are depicted in Table 14.<sup>38</sup> Firms previously less reliant on the main bank benefited more from the minibond issuance. They decreased used bank credit by 44% and the ratio of used to granted credit by 13 p.p. Furthermore they obtained a significant reduction in lending rates, by 27 bps on advances and particularly by 47 bps on long-term loans. Firms with stronger ex-ante reliance on the main bank achieved lower credit substitution, as they reduced credit used by 26% and the ratio of credit used to granted by 8 p.p., but did not observe any statistically significant decrease in lending rates.

#### 6.2. Ex-Post Outcomes: Firm Performance and Balance Sheet Indicators

The firm-level analysis suggests that firms issuing minibonds managed to improve their financing conditions and to expand the overall amount of financial debt they have access to, while reducing their reliance on bank credit. This raises the question whether this diversification of funding sources had some positive impact also on the ex-post performance of these firms.

We investigate the potential effects of the (first) minibond issuances on firm performance by estimating a difference-in-differences model for some indicators of asset and liability composition, turnover and profitability, by comparing issuer firms versus ex-ante matched non-issuer firms. On the asset side, we consider the log of total assets, total fixed assets, tangible and intangible fixed assets; the ratios of, respectively, total fixed assets, tangible and intangible fixed assets, over total assets. On the liability side, we analyze the ratio of bank debt to total financial debt, the ratio of total financial debt to turnover, and the leverage ratio. In addition, we investigate the log of turnover and two measures of profitability, i.e., the return on assets and the return on equity. We compare firm performance in the year

30

<sup>&</sup>lt;sup>38</sup> The ratio of the used credit from the main bank to the total used bank credit has a median, in percentage points, equal to 26.74%.

before the issuance and in the two following years. The estimates consider firm and time fixed effects according to the specification:

(4) 
$$Y_{i,t} = \alpha_i + \alpha_t + \beta_1 \text{ post}_{i,t} * \text{minibond}_i + \epsilon_{i,t}$$

where Post<sub>t</sub> is equal to 1 in the two years following the issuance and 0 in the year before the issuance, while  $\alpha_i$  and  $\alpha_t$  are respectively firm and year fixed effects.

Estimates are depicted in Table 13. The average treatment effect of the first issuance on firm balance sheet and performance is measured by the coefficient for the double interaction between minibond<sub>it</sub> and post<sub>t</sub>.

After the issuance, treated firms display an increase in total assets by around 19% (col. 1), partly as a mechanical effect of the rise in financial resources. The composition of the increase gives some insights on the use of those resources. Total fixed assets rise by around 15% (col. 2), mainly thanks to the increase in intangible fixed assets, by around 25% (col. 4); while tangible fixed assets show a modest increase, not statistically significant. Therefore, issuer firms invested more in patents, copyrights, trademarks, possibly financing these additional investments with minibond issuances. Since the postissuance increase in both types of fixed assets was broadly proportional to the increase in total assets, we do not observe any significant change in the ratios of tangible and intangible fixed assets to total assets for treated firms after the issuance.

This asset expansion has been possible thanks to a substantive increase in the amount of total financial debt. Indeed, issuer firms increased their leverage by 10.2 percentage points. However, the increase in leverage was accompanied by a greater diversification of funding sources: issuer firms reduced the share of bank debt out of total financial debt by 23 percentage points.

We explore whether this balance sheet expansion and these investments in fixed assets may have contributed positively to the performance of issuer firms. However, we do not find significant changes in the amount of turnover after the first minibond. Since issuer firms used additional funding to increase particularly their intangible fixed assets, the effects of this on turnover may be somehow delayed. Also, we do not observe relevant changes in the profitability of issuer firms: the coefficient for ROE is not significant, while the significant and negative result for ROA (-2.49) is most likely driven by the increase in total assets.

The results discussed above refer to two years after the first minibond issuance. We also explored the effects of minibonds over a shorter time horizon, one year after the first issuance, and most of the estimated effects are confirmed with the exception of the investments in intangible fixed assets<sup>39</sup>.

#### 7. Robustness Checks

We conduct several robustness checks on subsamples differing for bond size and maturity or for firm size and location. Results are reported in Tables 16 and 17.

#### 7.1. Bond Size and Maturity

The characteristics of the issued minibonds may be relevant in shaping the effects of the issuance on firms' financing conditions.

The debt maturity profile of issuer firms can affect funding conditions. On one hand, firms which can rely on longer-term funding sources may be perceived as less risky and, therefore, benefit from better financing conditions. As long as debt securities have a longer maturity than bank loans, the observed partial substitution between bank lending and debt issuances may reduce the perceived risk of the issuer firms and lower the lending rates charged by banks. On the other hand, bonds with longer maturity may be subject to higher yields than short-term debt instruments, due to the upward slope of the yield curve. This may limit the incentive to decrease lending rates after the issuance in a bargaining power perspective, as the reduction in bank lending rates to issuer firms may depend on their funding costs via the alternative market funding source. If so, the decrease in lending rates should be smaller for firms issuing longer-term minibonds subject to higher yields. We investigate this issue by estimating the main regressions on a subsample of minibonds with a maturity of at least two years (Panel A in Tables 16 and 17).

Our previous results are broadly confirmed, though with some difference in the magnitude of the effects. In the firm-bank level analysis, firms issuing minibonds with a maturity of at least two years showed a reduction of lending rates on advances by 30 bps and on long-term loans by 19 bps (Table 16 Panel A), slightly less than in the overall sample. However, the results at the firm-level (Table 17 Panel A) are very similar to our baseline specification: firms issuing minibonds with longer maturities benefit from a reduction in lending rates by 26 bps on advances and 42 bps on long-term loans. Overall, the

<sup>&</sup>lt;sup>39</sup> The results of this specification are available in Appendix B.

estimates on the longer maturity sample do not support the argument about the lower risk perception of more stable funding, but may be consistent with the hypothesis of a lower bargaining power associated with the higher yields for longer-term minibond.

On lending volumes, results on the subsample are similar to the overall sample. Notably, at the firm level, issuer firms reduced their amount of used bank credit by slightly less than the overall sample, around 30 percent versus 36 percent. This may be due to a smaller reduction in the more costly short-term loans, given the lower substitutability between bonds with longer maturity and short-term loans.

The bond issuance amount could also be relevant in explaining the effect of funding diversification, once we control for firm size: minibond issuances of larger amounts may be more effective in increasing firms' bargaining power and as substitutes for bank debt. We investigate this on a subsample of issuances with volume of at most EUR 20 million (Tables 16 and 17, Panel B).

Estimates on lending rates, controlling for firm size and other firm's specific characteristics, are comparable with the overall sample. Instead, the effects on lending volumes are substantially smaller: in the firm-bank level analysis, firms issuing smaller minibonds reduce the amount of used bank credit by around 27%, compared with over 60% in the overall sample; at the firm-level, used bank credit decreases by only 8%, versus 36% in the overall sample.

These results suggest that debt issuances of smaller amount allow for a more limited substitution between loans and bonds, although the gain on lending rates is not affected.

#### 7.2. Firm Size and Location

Different types of firms are likely to benefit from minibond issuance in various ways.

As discussed in Section 3, particularly in the months right after the reform also some large firms took the opportunity to enter the debt capital market by issuing minibonds instead of employing other types of debt securities which were available to them. These firms may have gained better funding conditions, too.

Since the minibond reform was introduced primarily to improve the access to finance for SMEs, we are interested in developing estimates specifically for medium and small firms. For this purpose, we conduct our analysis on a subsample of firms with turnover below or equal to EUR 50 million.<sup>40</sup>

<sup>&</sup>lt;sup>40</sup> This is one of the criteria used for the classification of medium and small firms. Another criterion is related to the amount of total assets (a firm is defined as a SME if it has an amount of total assets below or equal to EUR 43 million).

Although this reduces the sample of treated firms, results on SMEs confirm the findings on the overall sample (Tables 16 and 17, Panel C).

At the firm level, the reduction in lending rates is slightly smaller than in the overall sample, but still sizeable (decrease by 31 bps on long-term loans). On the other hand, the substitution between debt issuance and bank loans is more limited (the amount of used bank credit decrease by 23% and 8% at the firm-bank and firm-level respectively; the ratio between credit used and credit granted declines by around 6 p.p.). The increase in total financial debt is instead as large as in the overall sample.

These results confirm that SMEs took the opportunity of minibond issuances to increase their leverage by broadening the range of funding sources. The smaller degree of substitution between bank loans and debt issuances, even under the comparable increase in total debt, suggests that minibond issuances were used by SMEs not only to substitute bank lending, but also to obtain additional funding. The smaller reduction in the amount of bank loans, together with the higher risk perception associated with SME lending, may explain the slightly smaller post-issuance decrease in lending rates.

At last, we investigate whether firm location may play some role in firms' capital structure, to the extent that the proximity to financial centers or to stock exchanges may foster information about new funding sources like minibonds. Firms closer to the headquarters of the stock exchange may be better informed and therefore have higher chances to use these new debt instruments. We want to investigate whether our results hold for farther firms as well.

Therefore, we focus on a subsample of firms located outside Lombardy, since the ExtraMot Pro Platform is a multilateral trading platform provided by the Italian Stock Exchange ("Borsa Italiana") with headquarters in Milan; moreover, Milan is the main financial center for Italy, where most investment banks are headquartered.

Estimates on the subsample (Tables 16 and 17, Panel D) confirm the results obtained on the overall sample, both at firm-bank level, and at the firm level. Therefore, the effects described above are robust also to the potential differences in the likelihood to issue minibonds, which could be related to the location of firms.

#### 7.3. Propensity Score Matching

We carry out further robustness checks on an alternative control sample identified through propensity score matching, instead of the coarsened exact matching. The estimation of the propensity score and of the corresponding difference-in-differences regressions are presented in the Appendix C.

We first conduct a probit analysis to investigate the determinants of the first minibond issuance. The results highlight the relevance of the firm-level characteristics employed in the exact matching in explaining the issuance behavior, providing support to the unconfoundness assumption in the matching process. The flexibility of the propensity score matching allows us also to further restrict the matching criteria, without the risk of losing potential treated firms: we use more granular classification for location and classes of economic activity. Separate control groups are identified implementing both the nearest neighbor algorithm and the radius matching with different degree of closeness.<sup>41</sup>

The results based on the propensity score matching confirm the estimates from the coarsened exact matching, and are robust to the restriction of the matching criteria in the propensity score, to the use of different matching algorithms, and to the selection of smaller number of control firms in the matching.

#### 8. Conclusions

This paper analyses the effects of the diversification of funding sources – via the issuance of corporate bonds – on the financing costs and on the debt structure of issuer firms versus ex-ante comparable non-issuer firms. We exploit the introduction of a recent regulatory reform in Italy aimed at removing the existing restrictions on the issuance of corporate bonds by unlisted firms. This reform provides an interesting deregulation experiment as it enabled firms previously relying only on bank credit to get funding also from capital markets through the issuance of the so-called minibonds.

We focus on minibond issuances between the end of 2012 and the end of 2016. We investigate whether the use of market-based finance allowed issuer firms to obtain more favorable credit conditions in their firm-bank relationships, thanks to an increase in their bargaining power with banks. Given that only some of the many eligible firms issued minibonds, we develop an exact matching procedure to identify – per each issuer firm – a control sample of ex-ante comparable non-issuer firms, according to their size, location, activity and financial characteristics before the first issuance. Then we can identify the impact of the minibond issuance applying a difference-in-differences methodology. The treatment effect is measured in the quarter of the first issuance and in the following two quarters, compared to the

<sup>&</sup>lt;sup>41</sup> First, to enhance the comparability with the estimates based on the exact matching, we implement the algorithms for the nearest neighbor and the radius matching to obtain control samples as numerous as the one in the CEM procedure. Then, as robustness check, we also perform nearest neighbor matching selecting the closest one and five control firms.

two quarters before the event; however, estimates over a longer period - including six quarters after the issuance - show similar results.

Even though minibonds were more costly than bank credit, the analysis shows that issuer firms obtained lower lending rates charged by banks, particularly on long-term loans and advances. This effect is driven by the lending behavior of inside banks, which had existing lending relationships with the issuer firms. These results support the argument that the diversification of funding sources allows firms to reduce the hold-up effect of firm-bank relationships and to increase their bargaining power with banks.

Furthermore, issuer firms changed the composition of their debt structure by decreasing their reliance on bank credit. They reduced significantly the amount of bank credit used while increasing the overall amount of financial debt, suggesting that the minibond issuances led to a partial substitution between bank loans and capital markets funding. Thanks to the issuance of minibonds, the total amount of financial debt taken by issuer firms increased by around 40 percent. Importantly, the large increase in total financial debt was achieved by issuer firms without observing any significant change in their overall financing costs: indeed, the swift reduction in bank lending rates after the first issuance was large enough to balance the higher coupon rates on minibond issuances.

We also explore whether the improvement in financial conditions has any implications on the performance of firms. Comparing one year before with two years after the minibond issuance, we find that issuer firms increase their amount of total assets and of fixed assets, particularly intangible fixed assets, signaling that they invested more in patents, copyrights, trademarks. Moreover, although the leverage of issuer firms raises, their share of bank debt out of total financial debt decreases. Firms' turnover and profitability are not significantly affected, as a longer time horizon may be needed to appreciate the effects of higher funding and investment.

Our analysis has relevant implications for the design of policy initiatives in the domain of the Capital Markets Union, particularly in the current debate on the financing solutions for the recovery of the private sector from the Covid-19 crisis. This paper shows that deregulation reforms removing previous restrictions to the use of market-based finance may provide a significant contribution to promote funding diversification and to increase the amount of financial resources available to firms. Furthermore, provided that small and medium enterprises may still satisfy a significant part of their funding needs through bank credit, this study finds that this diversification can be beneficial in many ways: better financing conditions on bank loans, larger funds availability, a more balanced maturity profile.

#### References

- Accornero, M., P. Finaldi Russo, G. Guazzarotti, and V. Nigro (2015). First-time Corporate Bond Issuers in Italy. *Bank of Italy Occasional Paper Series*, 269.
- Accornero, M., P. Finaldi Russo, G. Guazzarotti, and V. Nigro (2018). Missing Investors in the Italian Corporate Bond Market. *Bank of Italy Occasional Paper Series*, 450.
- Albareto, G., and G. Marinelli (2018). Italian Banks and Market-Based Corporate Financing. *Bank of Italy Occasional Paper Series*, 432.
- Altavilla C., F. Barbiero, M. Boucinha, and L. Burlon (2020). The Great Lockdown: Pandemic Response Policies and Bank Lending Conditions. *ECB Working Paper Series*, 2465.
- Altman E. I. (1968). Financial Ratios, Discriminant Analysis and the Prediction of Corporate Bankruptcy. *The Journal of Finance*, 23, 589-609.
- Altman, E. I., A. Gande, and A. Saunders (2010). Bank Debt versus Bond Debt: Evidence from Secondary Market Prices. *Journal of Money, Credit and Banking*, 42 (4), 755-767.
- Barone, G., R. Felici, and M. Pagnini (2011). Switching Costs in Local Credit Markets, *International Journal of Industrial Organization*, 29 (6), 694-704.
- Beck T., E. Carletti, and B. Bruno (2021). Unwinding COVID Support Measures for Banks, *VoxEU*, 17 March 2021.
- Becker, B. and V. Ivashina (2018). Financial Repression in the European Sovereign Debt Crisis. *Review of Finance*, 22 (1), 83-115.
- Becker, B. and V. Ivashina (2014). Cyclicality of Credit Supply. *Journal of Monetary Economics*, 62, 76-93.
- Berg, T., A. Saunders, and S. Steffen (2016). The Total Cost of Corporate Borrowing in the Loan Market: Don't Ignore the Fees. *The Journal of Finance*, 71 (3), 1357-1392.
- Besanko, D. and G. Kanatas (1993). Credit Market Equilibrium with Bank Monitoring and Moral Hazard. *Review of Financial Studies*, 6 (1), 213-232.
- Bhatia, A. V., S. Mitra, A. Weber, S. Aiyar, L. Antound de Almeida, C. Cuervo, A. Oliveira Santos, and T. Gudmundsson (2019). A Capital Market Union for Europe, *IMF Discussion Note*, 19/07.
- Bolton, P., X. Freixas, L. Gambacorta, and P. E. Mistrulli (2016). Relationship and Transaction Lending in a Crisis. *Review of Financial Studies*, 29 (10), 2643-2676.
- Bolton, P., and X. Freixas (2000). Equity, Bonds and Market Debt: Capital Structure and Financial Market Equilibrium under Asymmetric Information. *Journal of Political Economy*, 108 (2), 324-351.
- Bonfim, D., G. Nogueira, and S. Ongena (2021). Sorry, we're Closed: Loan Conditions when Bank Branches Close and Firms Transfer to Another Bank. *Review of Finance*, 25(4), 1211-1259.
- Boot, A., and A. Thakor (1997). Financial System Architecture. *Review of Financial Studies*, 10 (3), 693-733.
- Cerved Group (2013). Is There a Market for Mini-bonds in Italy? A Snapshot of Unlisted Companies. *Cerved Group*.
- Committee on the Global Financial System (2019). Establishing Viable Capital Markets. CGFS Papers, No.62.
- Constâncio, V., K. Lannoo, and A. Thomadakis (2020). Rebranding Capital Markets Union: A Market Finance Action Plan. *Report of a CEPS-ECMI Task Force*.
- Darmouni, O., and M. Papoutsi (2021). The Rise of Bond Financing in Europe. Available at SSRN: <a href="https://ssrn.com/abstract=3748002">https://ssrn.com/abstract=3748002</a>.
- Darmouni, O., and K. Siani (2021). Crowding Out Bank Loans: Liquidity-Driven Bond Issuance, available at https://papers.ssrn.com/sol3/papers.cfm?abstract\_id=3693282.

- De Guindos, L., F. Panetta, and I. Schnabel (2020). Europe Needs a Fully Fledged Capital Markets Union Now more than Ever. *ECB Blog Post*, 2 September 2020.
- Denis, D.J., and V.T. Mihov (2003). The Choice among Bank Debt, Non-bank Private Debt, and Public Debt: Evidence from New Corporate Borrowings. *Journal of Financial Economics*, 70, 3–28.
- Diamond, D. (1991). Monitoring and Reputation: The Choice between Bank Loans and Directly Placed Debt. *Journal of Political Economy*, 99, 688-721.
- Diamond, D. (1984). Financial Intermediation and Delegated Monitoring. *Review of Economic Studies*, 51 (3), 393-414.
- Drucker, S., and M. Puri (2005). On the Benefits of Concurrent Lending and Underwriting. *Journal of Finance*, 60 (6), 2763-2799.
- EU Commission (2015). Building a Capital Markets Union. Green Paper.
- Financial Stability Board (2021). Covid-19 Support Measures. Extending, Amending and Ending, FSB Report to the G20.
- Financial Times (2020). EU Urged to Make Radical Changes to Boost Investment Sector. 10 June 2020, available at https://www.ft.com/content/68987cd1-3394-4a0c-a6a1-e8ab6c5001bf.
- Greenbaum, S., G. Kanatas, and I. Venezia (1989). Equilibrium Loan Pricing under the Bank-Client Relationship. *Journal of Banking and Finance*, 13 (2), 221-235.
- Group of Thirty (2020). Reviving and Restructuring the Corporate Sector Post-Covid: Designing Public Policy Interventions. G30 Working Group on Corporate Sector Revitalization. Available at https://group30.org/publications/detail/4820.
- Hale, G., and J. A. C. Santos (2009). Do Banks Price their Informational Monopoly? *Journal of Financial Economics*, 93, 185–206.
- Hale, G., and J. A. C. Santos (2009). The Decision to Access the Public Bond Market: the Role of Reputation, Funding Choices and Bank Relationships. *Journal of Banking and Finance*, 32, 1928–1940.
- High Level Forum on the Capital Markets Union (2020), A New Vision for Europe's Capital Markets, Final Report.
- Holmstrom, B., and J. Tirole (1997). Financial Intermediation, Loanable Funds and the Real Sector. *Quarterly Journal of Economics*, 112 (3), 663-691.
- Hoshi, T., A. Kashyap, and D. Scharfstein (1993). The Choice between Public and Private Debt: an Analysis of Post-Deregulation Corporate Financing in Japan. *NBER Working Paper Series*, 4421.
- Houston, J., and C. James (1996). Bank Information Monopolies and the Mix of Private and Public Debt Claims. *Journal of Finance*, 51 (5), 1863-1889.
- Iacus, S. M., G. King and G. Porro, (2011). Multivariate Matching Methods That Are Monotonic Imbalance Bounding. *Journal of the American Statistical Association*, 106 (493), 345-361.
- Iannamorelli A., S. Nobili, A. Scalia, and L. Zaccaria (2020). Asymmetric Information and Corporate Lending: Evidence from SME Bond Markets, *Bank of Italy Working Paper Series*, No. 1292.
- Ioannidou, V., and S. Ongena (2010). "Time for a Change": Loan Conditions and Bank Behavior when Firms Switch Banks. *Journal of Finance*, 65 (5), 1847-1877.
- Myers, S. C., and N. S. Majluf (1984). Corporate Financing and Investment Decisions when Firms Have Information that Investors do not Have. *Journal of Financial Economics*, 13, 187-221.
- Observatory Mini-Bond (2021). 7th Report on Mini-Bond. Politecnico di Milano.
- Observatory Mini-Bond (2020). 6th Report on Mini-Bond. Politecnico di Milano.
- Observatory Mini-Bond (2019). 5th Report on Mini-Bond. Politecnico di Milano.
- Observatory Mini-Bond (2018). 4th Report on Mini-Bond. Politecnico di Milano.
- Observatory Mini-Bond (2017). 3rd Report on Mini-Bond. Politecnico di Milano.
- Pagano, M., F. Panetta, and L. Zingales (1998). Why Do Companies Go Public? An Empirical Analysis. *Journal of Finance*, 53, 27-64.
- Petersen, M., and R. Rajan (1994). The Benefits of Lending Relationships: Evidence from Small Business Data. *The Journal of Finance*, 49 (1), 3-37.

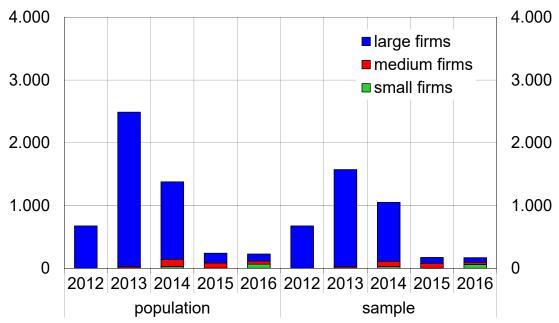
- Rajan, R. (1992). Insiders and Outsiders: The Choice between Informed and Arms'-Length Debt. *The Journal of Finance*, 47 (4), 1367-1400.
- Rauh, J. D., and A. Sufi. (2010). Capital Structure and Debt Structure. *The Review of Financial Studies*, 23 (12), 4242-4280.
- Rancoita E., M. Grodzicki, H. Hempell, C. Kok, J. Metzler, and A. Prapiestis (2020). Financial Stability Considerations Arising from the Interaction of Coronavirus-related Policy Measures, *Financial Stability Review*, European Central Bank, November.
- Santos, J. A. C., and A. Winton (2008). Bank Loans, Bonds and Information Monopolies across the Business Cycle. *Journal of Finance*, 63 (3), 1315-1359.
- Schenone, C. (2010). Lending Relationships and Information Rents: Do Banks Exploit their Information Advantages? *Review of Financial Studies*, 23 (3), 1149-1199.
- Schwert, M. (2020). Does Borrowing from Banks Cost More than Borrowing from the Market? *Journal of Finance*, 75 (2), 905-947.
- Schwert, M. (2018). Bank Capital and Lending Relationships. The Journal of Finance, 73 (2), 787-830.
- Sharpe, S. A. (1990). Asymmetric Information, Bank Lending, and Implicit Contracts: A Stylised Model of Customer Relationships. *Journal of Finance*, 45 (4), 1069-1087.
- Stein, I. (2015). The Price Impact of Lending Relationships. *German Economic Review*, 16 (3), 367-389.
- Sufi, A. (2009). Bank Lines of Credit in Corporate Finance: An Empirical Analysis. *Review of Financial Studies*, 22, 1057–1088.
- Von Thadden, E.-L. (2004). Asymmetric Information, Bank Lending and Implicit Contracts: the Winner's Curse. *Finance Research Letters*, 1 (1), 11-23.
- Wieser, T. (2020). We Must Resurrect EU Capital Markets Union. *Financial Times*. 10 June 2020, available at <a href="https://www.ft.com/content/7c70a858-79ba-4b3f-af80-7a207e14a558">https://www.ft.com/content/7c70a858-79ba-4b3f-af80-7a207e14a558</a>.

Figure 1: Minibond Issuances: Amount and Number of Firms

This figure displays the composition – in terms of firm size – of the population and of the sample used in the estimates of issuer firms across the years of the first minibond issuance. Firms are classified as small, medium or large in relation to their size based on their total assets, according to EU classification of firms (small: lower than 10 million; medium: 10 to 43 million; large: greater than 43 million). The charts display the composition of firms in terms of overall issuance amounts (in EUR millions, in the panel A) and of number of firms (in units, in the panel B).

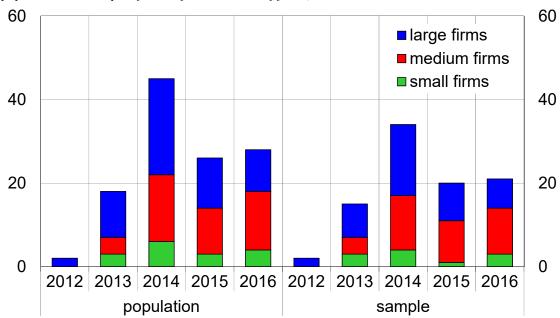
Panel A. Issuance amounts by year and firm size

(population and sample of issuer firms; Millions of Euros)



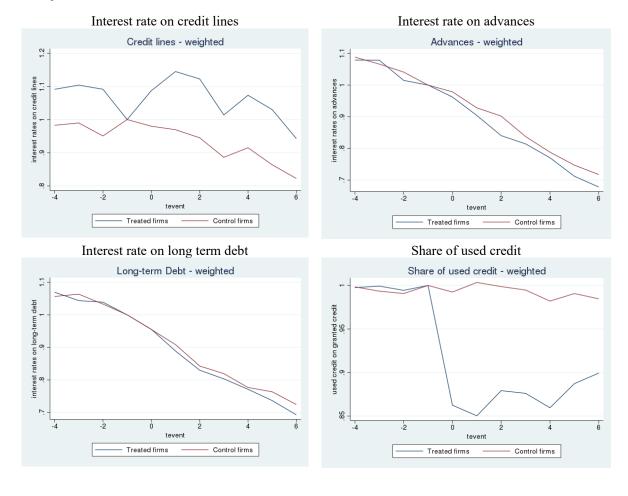
Panel B. Issuer firms by year and size

(population and sample of issuer firms; number of firms)



## Figure 2: Common Trends for Issuer and Control Firms

This figure is designed to check the common trends assumption for issuer (treated) firms and matched non-issuer (control) firms. We display graphically the dynamics of interest rates for distinct categories of loans (credit lines, advances and long-term debt) and of the share of credit used over credit granted. Both the lending rates and the ratio of used credit are expressed as weighted averages – at the firm-level – provided that the weights are based on the volumes of loans. We take note that the treatment (i.e., the first minibond issuance) occurs at different time for each firm, in a period between October 2012 and December 2016. Given that different issuance periods were also characterised by different conditions in interest rates and financing costs, we compare the trends in lending rates and volumes by normalizing the levels just before the time of the first issuance (*t-1*). We consider the issuer firms and the control non-issuer firms at the time of treatment, four quarter before and six quarters after the treatment.



**Table 1. Characteristics of Minibond Issuances** 

This table presents some descriptive statistics about the population and the sample used in the empirical analysis for minibond issuers. The population refers to all the issuances of minibonds, while the sample includes only the issuances of minibonds by firms included as treated in the analysis. The table reports – for the minibond issuances – the number of bonds and firms, the share of bonds with fixed rate coupon and the average coupon rate; the minibond issuances are classified by market and by issuance date.

	# Bonds	# Firms	Value (million Euros)	Share of fixed interest rate (%)	Average coupon rate						
		Population of issuer firms									
Market:											
ExtraMOT Pro	188	124	7,171	78.7	5.9						
Other	43	24	1,767	38.2	5.1						
Total	231	148	8,937	72.5	5.8						
Issuance date											
2012	2	2	675	-	-						
2013	39	26	3,884	82.9	7.1						
2014	70	59	1,746	79.4	5.8						
2015	43	33	406	81.0	5.4						
2016	77	46	2,226	57.1	5.3						
		Sample use	d in the empir	rical analysis							
Market											
ExtraMOT Pro	107	73	2,765	83.2	6.1						
Other	33	19	1,417	26.9	4.9						
Total	140	92	4,182	72.2	6.0						
Issuance date											
2012	2	2	675	-	-						
2013	18	15	1,572	86.7	7.5						
2014	40	35	1,052	87.2	6.3						
2015	27	22	200	84.6	5.7						
2016	53	29	683	50.9	5.3						

Table 2 - Characteristics of Minibond Issuers and Control Firms:

Composition and Balance Sheet Data

This table presents some firm-level descriptive statistics regarding the issuer firms and the ex-ante comparable non-issuer firms selected for the control sample. The descriptive statistics present the composition of the two sets of firms according to different variables (economic activity, firm size, firm location, Z-Score) and some balance sheet characteristics before the introduction of the minibond (as median values for the period 2010-2012).

	Treated firms	Control firms	Potential control firms	_	Treated firms	Control firms	Potential control firms
Observations	92	2666	30120	Z-score			
				Low risk	46.2	43.5	60.3
Economic Activity Agriculture and				Medium risk	35.7	41.3	30.8
fishing	2.2	2.2	1.4	High risk	18.0	15.2	8.9
Manufacturing	45.0	45.7	37.9				
Non-	10.4	0.0	5.4	Balance sheet data (median values,			
manufacturing	10.4	9.8		2010-12)			
Construction	4.5	4.3	6.0	EBITDA / Assets	7.09	6.47	6.95
Service industries	37.9	38.0	49.3	ROA	4.35	3.32	3.93
Ta				ROE	6.35	4.9	5.83
Firm size: (firm's total assets)				Leverage (2)	65.24	63.96	47.67
Small	12.5	13.0	27.7	Cost of debt/EBITDA	23.18	16.44	9.89
Medium	42.6	41.3	51.6	Wages/Turnover	16.99	10.86	12.31
Large	44.9	45.7	20.6	Fixed Assets / Assets Tangible fixed	0.20	0.20	0.20
				assets/Assets Delta fixed	0.11	0.14	0.15
Firm Location				assets/assets (t-1) Delta tangible Fixed assets / tangible fixed	0.44	0.04	0.13
North	77.2	77.2	67.2		3.08	0.95	3.67
Centre	12.5	13.0	18.0				
South and Isles	10.4	9.8	13.9				

<sup>(1)</sup> Based on firm's total assets, according to EU classification of firms (small: lower than 10 million; medium: 10 to 43 million; large: greater than 43 million). (2) The leverage ratio is measured as the share of financial debt over the sum of financial debt and net worth.

Table 3 - Characteristics of Minibond Issuers and Control Firms: Interest Rates, Bank Loans and Financial Debt

This table presents some firm-level descriptive statistics regarding the issuer firms and the ex-ante comparable non-issuer firms selected for the control sample. It reports some firm-level characteristics: 1) for the interest rates on different types of banks loans, on all bank loans and on total financial debt; 2) for the composition and use of bank loans, including the ratio between credit used and granted, the composition of credit used and granted, and the number of lending relationships; 3) for the amounts of different types of financial debt, expressed as a percentage of firm total assets. The descriptive statistics report the averages of the quarterly observations for two periods, respectively the two quarters before the issuance of the first minibond (before) and the quarter of the issuance and the following two quarters (after). Please note that the minibonds were issued in different time periods. The table displays also, respectively for treated and control firms, the differences in means of each variable comparing two quarters before with the issuance quarter and the two following quarters, and reports the results of the two-sample t-test for the statistical significance of the differences-in-means. \*\*\*, \*\* and \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

	Before		Af	ter		fter – fore	(after-before) Treated firms
	Treated firms	Control firms	Treated firms	Control firms	Treated firms	Control firms	(after-before) Control firms
1. Interest Rates							
Outstanding credit lines	7.44	7.57	7.95	7.49	0.51	-0.08	0.59
Outstanding advances	4.16	3.31	3.73	3.04	-0.43**	-0.27***	-0.16
New long term loans	4.93	4.23	4.31	3.75	-0.62***	-0.48***	-0.14
Total bank loans Total financial debt (incl.	4.81	4.05	4.43	3.75	-0.38*	-0.30***	-0.08
minibonds)	4.81	4.05	4.95	3.75	0.14	-0.30***	0.44*
2. Bank Loans: Composition a	nd Relatio	nships					
Used/granted (percent)	75.8	62.7	65.7	62.9	-10.1***	0.2	-10.3***
Composition granted (percent)							
Credit lines	8.4	9.9	9.4	9.8			
Advances	28.7	36.3	29.1	36.0			
Long-term loans	62.9	53.8	61.5	54.2			
Composition used (percent)							
Credit lines	5.6	6.5	2.5	5.7			
Advances	23.8	28.6	22.2	28.4			
Long-term loans	70.5	65.2	75.3	66.5			
Number of banks by firm	13.8	9.0	13.3	9.4			
3. Financial Debt (percent. To	tal Assets)						
Used loans (banks) Used loans (banks, other	28.6	28.6	23.8	28.9	-4.8***	0.3	-5.1**
intermediaries)	32.9	32.6	28.1	32.6	-4.8***	0.1	-4.7*
Minibonds Total financial debt (incl.	0.0	0.0	17.3	0.0	17.3***	0.0	17.3***
minibonds)	32.9	32.6	42.8	32.6	9.8***	0.1	9.9***

# Table 4. Firm-bank Level Analysis Effects of the First Minibond Issuance on Lending Rates

This table presents the results of the difference-in-differences regression for the changes in lending rates at the firmbank level after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on exante firm-level characteristics. The control group is selected in each year, and each firm in the control group is assigned the same time of event of the matched treated firms in that year. The regression includes bank, firm and year fixed effects. Given the inclusion of firm and time fixed effects, the coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect of the first issuance on lending rates at the firm-bank level, for different categories of credit contracts (credit lines, advances, long-term loans). We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. The lending rates are expressed in percent rates. While Col. 1, 3 and 5 correspond to the specifications with the fixed effects and the diffin-diff interaction term, Col. 2, 4 and 6 report also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \*\* indicate, respectively, statistical significance at 1, 5, 10 percent level.

	(1)	(2)	(3)	(4)	(5)	(6)
	Credi	t lines	Adva	ances	Long	-Term
Minibond * Post	0.052	0.050	-0.285***	-0.294***	-0.289***	-0.279***
	[0.155]	[0.158]	[0.099]	[0.096]	[0.073]	[0.074]
Ln (Total Assets <sub>t-4</sub> )		0.232		0.042		-0.222*
		[0.253]		[0.107]		[0.118]
Leverage <sub>t-4</sub>		-0.009		0.007**		0.002
		[0.007]		[0.003]		[0.004]
Z-Score <sub>t-4</sub>		0.106		0.299***		-0.035
		[0.072]		[0.039]		[0.037]
Firm FE	YES	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	64503	64503	66458	66458	49177	49177
R-Squared	0.001	0.001	0.010	0.020	0.015	0.017
No. Firms	2549	2549	2393	2393	2268	2268
No. Issuers	90	90	81	81	86	86

# Table 5. Firm-bank Level Analysis Effects of the First Minibond Issuance on Credit Volumes

This table presents the results of the difference-in-differences regression for the changes in lending volumes at the firmbank level after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on exante firm-level characteristics. The control group is selected in each year, and each firm in the control group is assigned the same time of event of the matched treated firms in that year. The regression includes bank, firm and year fixed effects. Given the inclusion of firm and time fixed effects, the coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect of the first issuance on lending volumes at the firm-bank level, respectively for credit used, credit granted and for the ratio between credit used and credit granted, for all the types of credit contracts. We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. While Col. 1, 3 and 5 correspond to the specifications with the fixed effects and the diff-in-diff interaction term, Col. 2, 4 and 6 report also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

	(1)	(2)	(3)	(4)	(5)	(6)
	Credi	t Used	Credi	t Granted	Used /	Granted
Minibond * Post	-0.604***	-0.627***	-0.082	-0.115	-0.112***	-0.110***
	[0.141]	[0.140]	[0.069]	[0.070]	[0.019]	[0.019]
Ln (Total Assets <sub>t-4</sub> )		0.302***		0.327**		-0.049***
		[0.100]		[0.139]		[0.013]
Leverage <sub>t-4</sub>		0.013***		0.007***		0.001***
<b>C</b>		[0.003]		[0.002]		[0.001]
Z-Score <sub>t-4</sub>		0.055		-0.119***		0.017***
		[0.052]		[0.038]		[0.007]
Firm FE	YES	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	99906	99906	189060	189060	97213	97213
R-Squared	0.001	0.004	0.000	0.002	0.002	0.007
No. Firms	2744	2744	2758	2758	2729	2729
No. Issuers	91	91	92	92	91	91

## Table 6. Firm-bank Level Analysis Effects of the First Minibond Issuance on Credit Used, for Types of Bank Loans

This table presents the results of the difference-in-differences regression for the changes in lending volumes (credit used) at the firm-bank level after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on ex-ante firm-level characteristics. The control group is selected in each year, and each firm in the control group is assigned the same time of event of the matched treated firms in that year. The regression includes bank, firm and year fixed effects. Given the inclusion of firm and time fixed effects, the coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect of the first issuance on the volumes of credit used at the firm-bank level, for different categories of credit contracts (credit lines, advances, long-term loans). We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. While Col. 1, 3 and 5 correspond to the specifications with the fixed effects and the diff-in-diff interaction term, Col. 2, 4 and 6 report also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, indicate, respectively, statistical significance at 1, 5, 10 percent level.

	(1)	(2)	(3)	(4)	(5)	(6)
	Credi	t lines	Adv	ances	Long	-Term
Minibond * Post	-0.570***	-0.563***	-0.532***	-0.513***	-0.430***	-0.468***
	[0.102]	[0.101]	[0.096]	[0.099]	[0.155]	[0.156]
Ln (Total Assets <sub>t-4</sub> )		-0.099		-0.449***		0.526***
		[0.100]		[0.126]		[0.128]
Leverage <sub>t-4</sub>		0.003		0.012***		0.011***
-		[0.003]		[0.003]		[0.004]
Z-Score <sub>t-4</sub>		0.102**		0.073		-0.033
		[0.045]		[0.060]		[0.052]
Firm FE	YES	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	99906	99906	99906	99906	99906	99906
R-Squared	0.002	0.003	0.001	0.006	0.001	0.005
No. Firms	2744	2744	2744	2744	2744	2744
No. Issuers	91	91	91	91	91	91

#### Table 7. Firm-bank Level Analysis

## Effects of the First Minibond Issuance on Lending Rates and Volumes (longer post-issuance period)

This table presents the results of the difference-in-differences regression for the changes in lending rates and volumes at the firm-bank level after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on ex-ante firm-level characteristics. The control group is selected in each year, and each firm in the control group is assigned the same time of event of the matched treated firms in that year. The regression includes firm and year fixed effects. Given the inclusion of firm and time fixed effects, the coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect - at the firm-bank level - of the first issuance on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, as well as for the ratio between used and granted bank credit (for all the types of credit contracts). We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following six quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2018. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

	Lendi	ng Rates		Lending Volumes	
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted
Minibond * Post	-0.361***	-0.321***	-0.588***	-0.106	-0.099***
	[0.116]	[0.099]	[0.143]	[0.088]	[0.019]
Ln (Total Assets <sub>t-4</sub> )	-0.181**	-0.272**	0.348***	0.427***	-0.037***
	[0.082]	[0.119]	[0.099]	[0.129]	[0.012]
Leverage <sub>t-4</sub>	0.007***	0.001	0.011***	0.010***	0.002***
	[0.002]	[0.002]	[0.002]	[0.002]	[0.000]
Z-Score <sub>t-4</sub>	0.280***	0.026	0.025	-0.122***	0.014***
	[0.027]	[0.026]	[0.035]	[0.029]	[0.004]
Firm FE	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES
Observations	117551	90925	179271	340308	174373
R-Squared	0.048	0.066	0.005	0.004	0.007
No. Firms	2414	2333	2745	2758	2731
No. Issuers	81	86	91	92	91

#### Table 8. Firm-bank Level Analysis.

#### Effects of the First Minibond Issuance on Lending Rates: Insider and Outsider Banks

This table presents the results of the difference-in-differences-in-differences estimation for the changes in lending rates charged at the firm-bank level by insider and outsider banks after the issuance of minibonds. We explore whether the changes in lending rates after the treatment may be different across insider and outsider banks. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on ex-ante firm-level characteristics. A bank is defined as outsider in a firm-bank lending relationship, if it has not provided credit in the 12 months before the minibond issuance, but extends credit to the firm in the issuance quarter or in the following ones. For the insider banks, we observe the lending rates charged before and after the minibond issuance. For outsider banks, we observe only the interest rates applied after the issuance, so we compute the counterfactual lending rate for the pre-issuance period as the average interest rate charged to the same firm by the insider banks before the minibond issuance. The regression includes bank, firm and year fixed effects. Given the inclusion of firm and time fixed effects, the coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect of the first issuance on lending rates at the firm-bank level, for different categories of credit contracts (credit lines, advances, long-term loans). The coefficient for the triple interaction term (Minibond \* Post \* Outsider) indicates whether and to what extent the average treatment effect on lending rates varies for the lending relationships with outsider banks. We consider two different estimation periods: in Col. 1-3, we compare the two quarters before the first issuance (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1); in Col. 4-6, we compare the two quarters before the first issuance (Post=0), against the quarter of the issuance and the following six quarters (dummy Post=1). The issuance period considered in the estimation is between the fourth quarter of 2012 and the end of 2016; the overall sample period include data from the second quarter of 2012 to the second quarter of 2018. The lending rates are expressed in percent rates. Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

	Post=1 for the	e issuance quart following ones		Post=1 for th	e issuance quart following ones	er and the six
	(1)	(2)	(3)	(4)	(5)	(6)
	Credit lines	Advances	Long term	Credit lines	Advances	Long term
Minibond * Post	0.052	-0.270***	-0.240***	0.127	-0.336***	-0.269***
	[0.149]	[0.091]	[0.064]	[0.175]	[0.114]	[0.088]
Minibond * Post* Outsider	0.383	-0.218	-0.034	0.703	-0.058	0.007
	[0.804]	[0.194]	[0.172]	[0.771]	[0.184]	[0.179]
Minibond * Outsider	-0.765	0.009	-0.063	-0.934	-0.066	-0.077
	[0.763]	[0.119]	[0.129]	[0.773]	[0.131]	[0.139]
Post* Outsider	0.377	-0.018	-0.362***	0.113	-0.186*	-0.521***
	[0.274]	[0.115]	[0.056]	[0.284]	[0.098]	[0.048]
Outsider	-0.544	0.234***	0.148***	-0.533	0.239***	0.185***
	[0.346]	[0.082]	[0.049]	[0.349]	[0.092]	[0.048]
Ln (Total Assets <sub>t-4</sub> )	0.227	0.042	-0.226*	0.190	-0.179**	-0.270**
	[0.252]	[0.110]	[0.121]	[0.194]	[0.085]	[0.120]
Leverage <sub>t-4</sub>	-0.009	0.007**	0.001	-0.004	0.007***	0.001
	[0.007]	[0.003]	[0.004]	[0.005]	[0.002]	[0.002]
Z-Score <sub>t-4</sub>	0.092	0.293***	-0.030	0.045	0.269***	0.029
	[0.072]	[0.039]	[0.037]	[0.065]	[0.027]	[0.026]
Firm FE	YES	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	64332	66211	48920	111250	115126	88274
R-squared	0.002	0.0211	0.020	0.005	0.049	0.068
No. Firms	2549	2393	2268	2593	2414	2333
No. Issuers	90	81	86	90	81	86

#### Table 9. Firm-level Analysis

## **Effects of the First Minibond Issuance on Lending Rates**

This table presents the results of the difference-in-differences regression for the changes in lending rates at the firmlevel after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on ex-ante firm-level characteristics. The control group is selected in each year, and each firm in the control group is assigned the same time of event of the matched treated firms in that year. The regression includes firm and year fixed effects. Given the inclusion of firm and time fixed effects, the coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect of the first issuance on lending rates at the firm-level, for different categories of credit contracts (credit lines, advances, long-term loans) and for the overall bank debt, as well as on the interest rates for the total financial debt used (including bank debt and bond issuances). We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period considered that between June 2012 up until June 2017. The lending rates are expressed in percent rates. While Col. 1, 3, 5, 7 and 9 correspond to the specifications with the fixed effects and the diff-in-diff interaction term, Col. 2, 4, 6, 8 and 10 report also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with

CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
	Cred	it lines	Adv	Advances		-Term	Overall bank loans			inancial ebt
Minibond * Post	0.606 [0.424]	0.535 [0.432]	-0.285*** [0.102]	-0.267*** [0.103]	-0.390*** [0.139]	-0.400*** [0.139]	-0.499* [0.294]	-0.472* [0.285]	0.067 [0.293]	0.092 [0.283]
Ln (Total Assets <sub>t-4</sub> )		1.202** [0.595]		-0.235 [0.357]		0.153 [0.389]		-0.476 [0.549]		-0.443 [0.550]
Leverage <sub>t-4</sub>		-0.025*** [0.009]		0.001 [0.004]		0.007* [0.004]		0.020* [0.012]		0.020* [0.012]
Z-Score <sub>t-4</sub>		0.118 [0.207]		0.015 [0.052]		0.090 [0.060]		0.065 [0.105]		0.078 [0.104]
Firm FE Year FE	YES YES	YES YES	YES YES	YES YES	YES YES	YES YES	YES YES	YES YES	YES YES	YES YES
Observations	12265	12265	11650	11650	11079	11079	12694	12694	12694	12694
R-Squared	0.001	0.004	0.058	0.059	0.083	0.089	0.003	0.003	0.002	0.003
No. Firms	2565	2565	2399	2399	2309	2309	2585	2585	2585	2585
No. Issuers	90	90	82	82	87	87	90	90	90	90

#### Table 10. Firm-level Analysis

#### Effects of the First Minibond Issuance on Lending Rates (longer post-issuance period)

This table presents the results of the difference-in-differences regression for the changes in lending rates at the firmlevel after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on ex-ante firm-level characteristics. The control group is selected in each year, and each firm in the control group is assigned the same time of event of the matched treated firms in that year. The regression includes firm and year fixed effects. Given the inclusion of firm and time fixed effects, the coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect issuance on lending rates at the firm-level, for different categories of credit contracts (credit lines, advances, long-term loans) and for the overall bank debt, as well as on the interest rates for the total financial debt used (including bank debt and bond issuances). We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following six quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2018. The lending rates are expressed in percent rates. While Col. 1, 3, 5, 7 and 9 correspond to the specifications with the fixed effects and the diff-in-diff interaction term, Col. 2, 4, 6, 8 and 10 report also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
	Credi	t lines	Adv	ances	Long	-Term		erall loans	Total Financial Debt	
Minibond * Post	0.611 [0.478]	0.572 [0.483]	-0.379*** [0.131]	-0.355*** [0.129]	-0.482*** [0.160]	-0.471*** [0.158]	-0.414** [0.199]	-0.392** [0.194]	0.230 [0.206]	0.250 [0.200]
Ln (Total Assets <sub>t-4</sub> )		0.472		-0.171		-0.105		-0.247		-0.224
		[0.495]		[0.179]		[0.236]		[0.290]		[0.290]
Leverage <sub>t-4</sub>		-0.007		-0.000		0.002		0.002		0.002
		[0.008]		[0.003]		[0.003]		[0.005]		[0.005]
Z-Score <sub>t-4</sub>		-0.091		0.075**		0.139***		0.053		0.055
		[0.175]		[0.037]		[0.044]		[0.144]		[0.143]
Firm FE	YES	YES	YES	YES	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES	YES	YES	YES	YES
Observations	20862	20862	20571	20571	19981	19981	22558	22558	22558	22558
R-Squared	0.010	0.011	0.148	0.151	0.162	0.169	0.003	0.003	0.003	0.003
No. Firms	2518	2518	2419	2419	2365	2365	2601	2601	2601	2601
No. Issuers	89	89	82	82	87	87	90	90	90	90

# Table 11. Firm-level Analysis Effects of the First Minibond Issuance on Credit Volumes

This table presents the results of the difference-in-differences regression for the changes in lending volumes at the firmlevel after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on ex-ante firm-level characteristics. The control group is selected in each year, and each firm in the control group is assigned the same time of event of the matched treated firms in that year. The regression includes firm and year fixed effects. Given the inclusion of firm and time fixed effects, the coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect of the first issuance on lending volumes at the firm-level, respectively for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts), as well as for the total financial debt used (including bank credit, debt from other financial intermediaries and minibond issuances). We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. While Col. 1, 3, 5 and 7 correspond to the specifications with the fixed effects and the diff-in-diff interaction term, Col. 2, 4, 6 and 8 report also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
	Credi	t Used	Credit	Granted	Used /	Used / Granted		Total Financial Debt Used	
Minibond * Post	-0.341***	-0.360***	-0.086	-0.105	-0.105***	-0.106***	0.404***	0.383***	0.098***
	[0.111]	[0.111]	[0.066]	[0.066]	[0.018]	[0.018]	[0.060]	[0.057]	[0.016]
Ln (Total Assets <sub>t-4</sub> )		0.221**		0.207**		0.020		0.259***	
		[0.097]		[0.082]		[0.023]		[0.098]	
Leverage <sub>t-4</sub>		0.005*		0.004**		-0.000		0.004*	
_		[0.003]		[0.002]		[0.000]		[0.003]	
Z-Score <sub>t-4</sub>		0.034		-0.019		0.016**		0.036	
		[0.039]		[0.020]		[0.007]		[0.028]	
Firm FE	YES	YES	YES	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES	YES	YES	YES
Observations	13609	13609	13609	13609	13494	13494	13624	13624	13624
R-Squared	0.006	0.009	0.007	0.015	0.013	0.018	0.006	0.011	0.006
No. Firms	2744	2744	2744	2744	2729	2729	2745	2745	2745
No. Issuers	91	91	91	91	91	91	91	91	91

#### Table 12. Firm-level Analysis

#### Effects of the First Minibond Issuance on Credit Volumes (longer post-issuance period)

This table presents the results of the difference-in-differences regression for the changes in lending volumes at the firmlevel after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on ex-ante firmlevel characteristics. The control group is selected in each year, and each firm in the control group is assigned the same time of event of the matched treated firms in that year. The regression includes firm and year fixed effects. Given the inclusion of firm and time fixed effects, the coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect of the first issuance on lending volumes at the firm-level, respectively for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts), as well as for the total financial debt used (including bank credit, debt from other financial intermediaries and minibond issuances). We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following six quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2018. While Col. 1, 3, 5 and 7 correspond to the specifications with the fixed effects and the diff-in-diff interaction term, Col. 2, 4, 6 and 8 report also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
	Credi	it Used Credit		Granted	Used /	Granted		Total Financial Debt Used	
Minibond * Post	-0.263**	-0.349***	-0.034	-0.097*	-0.092***	-0.099***	0.475***	0.392***	0.102***
	[0.115]	[0.114]	[0.058]	[0.058]	[0.018]	[0.018]	[0.063]	[0.056]	[0.016]
Ln (Total Assets <sub>t-4</sub> )		0.549***		0.419***		0.051***		0.528***	
		[0.115]		[0.089]		[0.016]		[0.097]	
Leverage <sub>t-4</sub>		0.005**		0.003**		0.000		0.005***	
8		[0.002]		[0.002]		[0.000]		[0.001]	
Z-Score <sub>t-4</sub>		-0.056		-0.046**		0.015***		0.002	
• •		[0.044]		[0.021]		[0.005]		[0.024]	
Firm FE	YES	YES	YES	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES	YES	YES	YES
Observations	24283	24283	24283	24283	24021	24021	24322	24322	24322
R-Squared	0.006	0.021	0.006	0.028	0.012	0.022	0.006	0.026	0.004
No. Firms	2745	2745	2745	2745	2731	2731	2745	2745	2745
No. Issuers	91	91	91	91	91	91	91	91	91

#### Table 13. Firm-level Analysis

#### Effects of the First Minibond Issuances: Firm Heterogeneity for Issuance Amounts

This table presents the results of the difference-in-differences regression for the changes in lending rates and volumes at the firm level after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on exante firm-level characteristics. The control group is selected in each year, and each firm in the control group is assigned the same time of event of the matched treated firms in that year. The regression includes firm and year fixed effects. Given the inclusion of firm and time fixed effects, the coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts) and for the total financial debt used, including bank credit, debt from other financial intermediaries and minibond issuances. We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following six quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2018. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

Panel A: Firms below or equal to the Median (Minibond/Total Used Loans)

	Lendi	Lending Rates		Lending Volume	es	Debt
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	Total Financial Debt
Minibond * Post	-0.071	-0.272	-0.046	0.022	-0.042***	0.158***
	[0.119]	[0.200]	[0.042]	[0.032]	[0.014]	[0.034]
Firm Controls	YES	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	6934	6559	7836	7836	7793	7836
R-Squared	0.082	0.085	0.005	0.010	0.014	0.008
No. Firms	1416	1361	1579	1579	1576	1579
No. Issuers	43	45	45	45	45	45

Panel B: Firms above the Median (Minibond/Total Used Loans)

	Lendi	Lending Rates		Lending Volume	es	Debt
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	Total Financial Debt
Minibond * Post	-0.467***	-0.523***	-0.644***	-0.207	-0.166***	0.613***
	[0.162]	[0.195]	[0.211]	[0.127]	[0.031]	[0.087]
Firm Controls	YES	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	5395	5151	6494	6494	6415	6509
R-Squared	0.049	0.123	0.016	0.027	0.035	0.017
No. Firms	1122	1078	1311	1311	1299	1312
No. Issuers	39	41	45	45	45	45

#### Table 14. Firm-level Analysis

#### Effects of the First Minibond Issuances: Firm Heterogeneity for Reliance on Main Bank

This table presents the results of the difference-in-differences regression for the changes in lending rates and volumes at the firm level after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on exante firm-level characteristics. The control group is selected in each year, and each firm in the control group is assigned the same time of event of the matched treated firms in that year. The regression includes firm and year fixed effects. Given the inclusion of firm and time fixed effects, the coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts) and for the total financial debt used, including bank credit, debt from other financial intermediaries and minibond issuances. We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following six quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2018. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

Panel A: Firms below or equal to the Median (Credit Main Bank/Total Used Credit)

	Lendi	Lending Rates		Lending Volume	Debt	
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	Total Financial Debt
Minibond * Post	-0.271***	-0.473***	-0.437**	-0.051	-0.127***	0.267***
	[0.103]	[0.180]	[0.172]	[0.044]	[0.028]	[0.068]
Firm Controls	YES	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	5729	5621	6369	6369	6284	6380
R-Squared	0.167	0.128	0.010	0.016	0.023	0.008
No. Firms	1172	1159	1285	1285	1270	1286
No. Issuers	43	44	45	45	45	45

Panel B: Firms above the Median (Credit Main Bank/Total Used Credit)

	Lendi	Lending Rates		Lending Volume	es	Debt
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	Total Financial Debt
Minibond * Post	-0.226	-0.347	-0.256*	-0.130	-0.084***	0.497***
	[0.183]	[0.215]	[0.136]	[0.124]	[0.021]	[0.080]
Firm Controls	YES	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	5921	5453	7235	7235	7205	7239
R-Squared	0.025	0.066	0.013	0.018	0.024	0.018
No. Firms	1227	1149	1458	1458	1458	1458
No. Issuers	39	42	45	45	45	45

#### Table 15. Firm-level Analysis

### Effects of the First Minibond Issuance on Firm Ex-post Outcomes

This table presents the results of the difference-in-differences estimation for the ex-post changes in the balance sheet and the performance of issuer firms after the first issuance of minibonds. We explore whether and how issuer firms changed their balance sheet composition, turnover and profitability, in the two years after the first issuance. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on ex-ante firm-level characteristics. The Minibond dummy is equal to 1 for the firms issuing minibonds, while the Post dummy is equal to 1 for the year following the minibond issuance. Given the inclusion of time fixed effects, the coefficient for the interaction between the first issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect of the first issuance on firm balance sheet and performance. We consider each dependent variable one year before the first issuance (Post=0), against the two years after the issuance (Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the fourth quarter of 2016; the overall sample period for firm balance sheets consider annual data from 2012 to 2017. Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, indicate, respectively, statistical significance at 1, 5, 10 percent level.

			ASSE	ETS			
	(1)	(2)	(3)	(4)	(5)	(6)	(7)
VARIABLES	Ln total assets	Ln total fixed assets	Ln tangible fixed assets	Ln intangible fixed assets	Total fixed assets/ Total assets	Tangible fixed assets/ Total assets	Intangible fixed assets/ Total assets
Minibond * Post	0.186*** [0.037]	0.148** [0.071]	0.066 [0.061]	0.247** [0.120]	-0.002 [0.009]	-0.005 [0.007]	0.003 [0.007]
Firm FE	YES	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES	YES
Observations	7287	7251	7220	6832	7287	7287	7287
R-squared	0.028	0.011	0.010	0.019	0.015	0.009	0.015
No. Firms	2722	2719	2713	2632	2722	2722	2722
No. Issuers	85	85	85	82	85	85	85

		LIABILITIES		TURNOVER AND PROFITABILITY			
	(8)	(9)	(10)	(11)	(12)	(13)	
VARIABLES	Bank debt/ Total financial debt	Total financial debt/ Turnover	Leverage	Ln turnover	RoA	RoE	
Minibond * Post	-0.233*** [0.028]	0.249 [0.158]	0.102*** [0.019]	0.049 [0.060]	-2.487*** [0.794]	-9.714 [6.205]	
Firm FE	YES	YES	YES	YES	YES	YES	
Year FE	YES	YES	YES	YES	YES	YES	
Observations	7077	7269	7287	7269	7287	7281	
R-squared	0.050	0.041	0.041	0.010	0.009	0.008	
No. Firms	2701	2721	2722	2721	2722	2722	
No Issuers	85	85	85	85	85	85	

# Table 16. Robustness Checks: Firm-Bank Level Analysis Effects of the First Minibond Issuance on Lending Rates and Volumes

This table presents the results of some robustness checks for the difference-in-differences regression on the changes in lending rates and volumes at the firm-bank level after the issuance of minibonds. In panel A we focus on a subsample of minibonds with an original maturity of at least 2 years. In panel B, we consider a subsample of minibonds with an issuance amount of at most EUR 20 million. In panel C, we focus on a subsample of firms with a turnover amount of at most EUR 50 million (and therefore classified as medium or small enterprises). In Panel D, we consider a subsample of firms located outside Lombardy, where the Italian Stock Exchange "Borsa Italiana" is placed (note that "Borsa Italiana" administers the ExtraMot Pro Platform for the listing of minibonds). The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non- issuer firms identified on the basis of a coarsened exact matching based on ex-ante firm-level characteristics. The control group is selected in each year, and each firm in the control group is assigned the same time of event of the matched treated firms in that year. The regressions include firm, bank and year fixed effects. The coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts). We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

Panel A. Bond Maturity: Above or Equal to Two Years

	Lendi	ng Rates		Lending Volumes	
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted
Minibond * Post	-0.298***	-0.191***	-0.625***	-0.121*	-0.114***
	[0.112]	[0.062]	[0.157]	[0.066]	[0.020]
Firm Controls	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES
Observations	54407	39800	81519	153745	79409
R-Squared	0.012	0.014	0.002	0.000	0.003
No. Firms	1971	1860	2246	2253	2235
No. Issuers	67	68	73	74	73

Panel B. Bond Issuance Amount: Below or Equal to EUR 20 Million

	Lending Rates			Lending Volumes			
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted		
Minibond * Post	-0.319***	-0.274***	-0.269***	0.037	-0.069***		
	[0.104]	[0.079]	[0.080]	[0.050]	[0.014]		
Firm Controls	YES	YES	YES	YES	YES		
Firm FE	YES	YES	YES	YES	YES		
Bank FE	YES	YES	YES	YES	YES		
Year FE	YES	YES	YES	YES	YES		
Observations	62643	46540	92030	173540	89665		
R-Squared	0.012	0.014	0.002	0.000	0.002		
No. Firms	2224	2127	2520	2534	2510		
No. Issuers	67	68	73	73	73		

Panel C. Firm Size: Turnover Below or Equal to EUR 50 Million

	Lendi	ng Rates		Lending Volumes	
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted
Minibond * Post	-0.162*	-0.316***	-0.232**	-0.005	-0.065***
	[0.089]	[0.121]	[0.102]	[0.055]	[0.017]
Firm Controls	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES
Observations	47434	34194	68857	130460	67080
R-Squared	0.007	0.014	0.001	0.000	0.001
No. Firms	1807	1724	2046	2060	2038
No. Issuers	49	50	54	55	54

Panel D. Firms located outside Lombardy (Less Proximity to the Italian Stock Exchange)

	Lendi	ng Rates		Lending Volumes	8 /
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted
Minibond * Post	-0.312***	-0.295***	-0.628***	-0.054	-0.116***
	[0.081]	[0.083]	[0.170]	[0.083]	[0.022]
Firm Controls	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES
Observations	38021	28411	59122	112969	57413
R-Squared	0.022	0.015	0.003	0.002	0.007
No. Firms	1393	1331	1584	1590	1579
No. Issuers	62	65	69	69	69

#### Table 17. Robustness Checks: Firm-level Analysis

#### Effects of the First Minibond Issuance on Lending Rates and Volumes

This table presents the results of some robustness checks for the difference-in-differences regression on the changes in lending rates and volumes at the firm-level after the issuance of minibonds. In panel A we focus on a subsample of minibonds with an original maturity of at least 2 years. In panel B, we consider a subsample of minibonds with an issuance amount of at most EUR 20 million. In panel C, we focus on a subsample of firms with a turnover amount of at most EUR 50 million (and therefore classified as medium or small enterprises). In Panel D, we consider a subsample of firms located outside Lombardy, where the Italian Stock Exchange "Borsa Italiana" is placed (note that "Borsa Italiana" administers the ExtraMot Pro Platform for the listing of minibonds). The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on ex-ante firm-level characteristics. The control group is selected in each year, and each firm in the control group is assigned the same time of event of the matched treated firms in that year. The regressions include firm and year fixed effects. The coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts) and for the total financial debt used, including bank credit, debt from other financial intermediaries and minibond issuances. We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

Panel A. Bond Maturity: Above or Equal to Two Years

	Lendi	Lending Rates		Lending Volume	es	Debt
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	Total Financial Debt
Minibond * Post	-0.263**	-0.422***	-0.299***	-0.113	-0.102***	0.393***
	[0.117]	[0.143]	[0.087]	[0.077]	[0.018]	[0.063]
Firm Controls	YES	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	9606	9064	11152	11152	11062	11167
R-Squared	0.058	0.100	0.008	0.016	0.017	0.012
No. Firms	1975	1892	2246	2246	2235	2247
No. Issuers	68	69	73	73	73	73

Panel B. Bond Issuance Amount: Below or Equal to EUR 20 Million

	Lending Rates			Lending Volume	es	Debt		
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	Total Financial Debt		
Minibond * Post	-0.276**	-0.407**	-0.080*	0.046*	-0.068***	0.311***		
	[0.117]	[0.158]	[0.042]	[0.027]	[0.014]	[0.058]		
Firm Controls	YES	YES	YES	YES	YES	YES		
Firm FE	YES	YES	YES	YES	YES	YES		
Year FE	YES	YES	YES	YES	YES	YES		
Observations	10853	10409	12498	12498	12408	12511		
R-Squared	0.069	0.088	0.011	0.016	0.018	0.013		
No. Firms	2228	2164	2520	2520	2510	2521		
No. Issuers	67	69	73	73	73	73		

Panel C. Firm Size: Turnover Below or Equal to EUR 50 Million

	Lendi	ng Rates	Lending Volumes			Debt
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	<b>Total Financial Debt</b>
Minibond * Post	-0.102	-0.307*	-0.083*	0.026	-0.058***	0.408***
	[0.124]	[0.181]	[0.048]	[0.029]	[0.016]	[0.076]
Firm Controls	YES	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	8828	8425	10150	10150	10090	10163
R-Squared	0.041	0.088	0.016	0.020	0.020	0.019
No. Firms	1809	1756	2046	2046	2038	2047
No. Issuers	49	50	54	54	54	54

Panel D. Firms located outside Lombardy (Less Proximity to the Italian Stock Exchange)

	Lendi	ng Rates	s Lending Volumes			Debt
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	Total Financial Debt
Minibond * Post	-0.257**	-0.395**	-0.267***	-0.060	-0.116***	0.313***
	[0.102]	[0.164]	[0.087]	[0.048]	[0.021]	[0.046]
Firm Controls	YES	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	6751	6507	7836	7836	7785	7836
R-Squared	0.065	0.084	0.025	0.020	0.026	0.025
No. Firms	1395	1361	1584	1584	1579	1584
No. Issuers	63	66	69	69	69	69

## Appendix A

## The Output of the Coarsened Exact Matching:

Table A.1 Summary Statistics: Number of Matched Firms per Issuer Firm

The table presents some descriptive statistics about the number of matched control firms per issuer firm, based on the output of the Coarsened Exact Matching along the criteria described in Section 4.3. It also reports the number of first-time issuer firms with 1, 2, 3,  $\leq$ 5, <10 and >20 matched control firms.

Number of Matched Firms per Issuer Firm									
Mean	Mean St. Dev. Min P25 P50 P75 Max								
28.98	28.98 44.74 1 3 8.75 32.25 213								

Number of Matched Firms per Issuer Firm									
=1 =2 =3 <5 <10 >20									
11	11 10 7 33 48 36								

Table A.2 Distribution of Matched Firms by CEM strata

The table reports the distribution of matched control firms per each CEM stratum corresponding to at least one treated firm. The ratio is computed by dividing the number of matched firms by the number of issuer firms in each CEM stratum. The table does not report the CEM strata including only control firms, which are not matched with treated firms.

	<u> </u>			
CEM Stratum	Matched Firms	Issuer Firms	Total	Ratio
1	1	1	2	1
2	2	1	3	2
3	21	1	22	21
4	16	1	17	16
5	2	1	3	2
6	9	1	10	9
7	56	1	57	56
8	48	1	49	48
9	2	1	3	2
10	3	1	4	3
11	8	1	9	8
12	8	1	9	8
13	58	1	59	58
14	157	1	158	157
15	3	1	4	3
16	1	1	2	1
17	25	1	26	25
18	1	1	2	1
19	156	1	157	156
20	35	1	36	35
21	25	1	26	25
22	29	1	30	29

23	22	1	23	22
24	40	1	41	40
25	7	1	8	7
26	187	1	188	187
27	175	1	176	175
28	10	1	11	10
29	3	1	4	3
30	6	1	7	6
31	47	1	48	47
32	17	1	18	17
33	3	1	4	3
34	169	1	170	169
35	213	1	214	213
36	5	1	6	5
37	192	2	194	96
38	18	1	19	18
39	1	1	2	1
40	66	1	67	66
41	33	1	34	33
42	1	1	2	1
43	3	1	4	3
44	2	1	3	2
45	3	1	4	3
46	2	1	3	2
47	7	1	8	7
48	64	1	65	64
49	66	1	67	66
50	18	1	19	18
51	11	1	12	11
52	5	1	6	5
53	5	1	6	5
54	7	1	8	7
55	13	1	14	13
56	5	1	6	5
57	54	1	55	54
58	17	2	19	8,5
59	28	1	29	28
60	8	1	9	8
61	3	1	4	3
62	64	2	66	32
63	25	1	26	25
64	85	2	87	42.5
65	41	1	42	41
66	27	1	28	27
67	1	1	2	1

68	2	1	3	2
69	11	1	12	11
70	1	1	2	1
71	4	1	5	4
72	18	1	19	18
73	1	1	2	1
74	26	1	27	26
75	33	1	34	33
76	53	1	54	53
77	1	1	2	1
78	7	1	8	7
79	8	1	9	8
80	1	1	2	1
81	1	1	2	1
82	2	1	3	2
83	10	1	11	10
84	2	1	3	2
85	28	1	29	28
86	2	1	3	2
87	8	1	9	8
88	2	1	3	2
Total	2666	92	2758	28.98

## Appendix B

#### Firm-level Outcomes after First Issuance

## Table B.1. Effects of the First Minibond Issuance on Firm Ex-post Outcomes (one year before vs one year after)

This table presents the results of the difference-in-differences estimation for the ex-post changes in the balance sheet and the performance of issuer firms after the first issuance of minibonds. We explore whether and how issuer firms changed their balance sheet composition, turnover and profitability, in the year after the first issuance. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a coarsened exact matching based on ex-ante firm-level characteristics. The Minibond dummy is equal to 1 for the firms issuing minibonds, while the Post dummy is equal to 1 for the year following the minibond issuance. Given the inclusion of firm and time fixed effects, the coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect of the first issuance on firm balance sheet and performance. We consider each dependent variable one year before the first issuance (Post=0), against the year after the issuance (Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the fourth quarter of 2016; the overall sample period for firm balance sheets consider annual data from 2012 to 2017. Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \*\* indicate, respectively, statistical significance at 1, 5, 10 percent level.

ASSETS								
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	
VARIABLES	Ln total assets	Ln total fixed assets	Ln tangible fixed assets	Ln intangible fixed assets	Total fixed assets/ Total assets	Tangible fixed assets/ Total assets	Intangible fixed assets/ Total assets	
Minibond * Post	0.150*** [0.031]	0.101 [0.067]	0.050 [0.061]	0.170 [0.118]	-0.009 [0.009]	-0.007 [0.007]	-0.001 [0.006]	
Firm FE Year FE	YES YES	YES YES	YES YES	YES YES	YES YES	YES YES	YES YES	
Observations	5273	5254	5231	4963	5273	5273	5273	
R-squared	0.035	0.023	0.023	0.019	0.010	0.010	0.016	
No. Firms	84	84	84	81	84	84	84	
No. Issuers	2721	2717	2710	2620	2721	2721	2721	

		LIABILITIES		TURNOVER AND PROFITABILITY		
	(8)	(9)	(10)	(11)	(12)	(13)
VARIABLES	Bank debt/ Total financial debt	Total financial debt/ Turnover	Leverage	Ln turnover	RoA	RoE
Minibond * Post	-0.244*** [0.028]	0.242* [0.136]	0.093*** [0.018]	0.030 [0.046]	-2.244*** [0.771]	-6.356 [4.543]
Firm FE Year FE	YES YES	YES YES	YES YES	YES YES	YES YES	YES YES
Observations	5144	5263	5273	5263	5273	5270
R-squared	0.066	0.043	0.049	0.007	0.013	0.014
No. Firms	84	84	84	84	84	84
No Issuers	2693	2720	2721	2720	2721	2721

## Appendix C

#### **Regressions Based on the Propensity Score Matching**

We conduct a further robustness check by estimating the difference-in-differences model on a control sample identified through the propensity score matching, instead of the exact coarsened matching.

We first compute the propensity score to issue minibonds based on ex-ante firm characteristics. We look at issuer firms in the year before the issuance and potential control firms in 2012, i.e., before the reform. We exclude ex-ante from the sample of potential controls the firms that differed from issuers in some prominent way: 1) those without lending relationships with banks; 2) those with an amount of total assets below EUR 1 million; 3) those with a rating very close to the default (Z-Score equal to 9 or 10, as no issuer firm has this rating); 4) those with negative values of leverage; 5) those located in regions where there are not issuers; 6) those operating in financial services (as by construction we consider only non-financial corporations for the sample of issuer firms); 7) those having already issued debt securities on the capital market.<sup>47</sup>

The propensity score is estimated through a probit regression for the probability to issue minibonds, using as covariates the following variables: a) the log of total assets; b) the leverage and the square of leverage (to capture potential non-linearities); c) the Z-Score and the square of the Z-Score; d) dummies for geographical areas (North, Centre, South); e) industry-level dummies (agriculture and fishing, manufacturing, utilities and extraction, construction, services); f) dummies for the main bank. The results from the estimation of the propensity score are presented in Table C.1.

We then estimate the diff-in-diff regressions implementing two different matching algorithms. First, we employ a nearest neighbor matching with replacement, to select the nearest 30 controls for each treated firm. Second, we apply a radius matching with replacement with a radius of 0.00006 around the propensity score of each treated firm. These choices are aimed at obtaining a number of control firms similar to the one used in the CEM procedure.

Table C.2 displays the estimates for the propensity score based on the nearest neighbor matching, while Table C.3 presents the results for the propensity score using the radius matching. Tables C.4 and C.5 show the results based on the nearest neighbor matching, while reducing the number of matched control firms respectively to five and one.

<sup>&</sup>lt;sup>47</sup>The same exclusions were applied in the coarsened exact matching. Furthermore, we had already excluded, also from the sample of potential controls for the exact matching, those firms which had already issued debt securities.

We estimate the propensity score also with stricter matching criteria, using more granular classification for location and classes of economic activity. Based on this, we first calibrate the nearest neighbor and the radius matching algorithms as in the baseline estimates of the propensity score matching. The results of these estimations are presented respectively in Tables C.6 and C.7. Then, we reduce the number of matched control firms used in the nearest neighbor algorithm respectively to five and one (see Tables C.8 and C.9).

#### Table C.1. Probit Analysis - First Step Propensity Score Matching

This table presents the results (coefficients and marginal effects) of the probit analysis on the issuance of the first minibond by firms. The results of this probit analysis give the propensity score to be used for the matching of control firms with treated firms. The covariates included in the regressions are: the log of total assets; the rating and the square of the rating; the leverage and the square of leverage; dummies for the main bank, for the location and the economic activity. As in the Coarsened Exact Matching, the specification in Col.1-2 considers three locations (North, Centre, South) and 5 classes of economic activity (agriculture and fishing; manufacturing industries; non-manufacturing industries, e.g. mining, electricity, gas; construction; services). The specification in Col. 3-4 uses the same firm-specific continuous variables, but employs a more granular classification of location (all the 20 Italian Regions) and economic activity (25 classes of activity based on ATECO codes). The firm-specific variables are observed in the year before the issuance for issuer firms and in 2012 for non-issuer firms. The overall sample period consider data from 2012 to 2015. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

	(1)	(2)	(3)	(4)
VARIABLES	Coeff	Marginal	Coeff	Marginal
Ln (Total Assets)	0.336***	0.003***	0.368***	0.002***
	[0.037]	[0.000]	[0.041]	[0.000]
Rating	0.430***	0.004***	0.456***	0.003***
	[0.138]	[0.001]	[0.147]	[0.001]
Rating^2	-0.036***	-0.000***	-0.041***	-0.000***
	[0.014]	[0.000]	[0.015]	[0.000]
Leverage	0.023***	0.000***	0.030***	0.000***
	[0.008]	[0.000]	[0.009]	[0.000]
Leverage^2	-0.000***	-0.000***	-0.000***	-0.000***
	[0.000]	[0.000]	[0.000]	[0.000]
Main bank	YES	YES	YES	YES
Location (3)	YES	YES	TES	TLS
Location (20)	TES	1123	YES	YES
Economic activity (5)	YES	YES	TES	1 LS
Economic activity (25)	1 LS	TES	YES	YES
Decinonine delivity (25)			125	1 110
Observations	13515	13515	13475	13475
Pseudo R2	0.158		0.226	

#### Table C.2. Propensity Score Matching with Nearest Neighbor

This table presents the results of the difference-in-differences regression for the changes in lending rates and volumes at the firm-bank level (panel A) and at the firm level (panel B) after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a propensity score matching (specification col. 1-2 in Table C.1), which uses a nearest neighbour algorithm with replacement to select the nearest 30 controls for each treated firm based on ex-ante firm-level characteristics. Each firm in the control group is assigned the same time of event of the corresponding matched treated firm. The regressions include bank, firm and year fixed effects in panel A, and firm and year fixed effects in panel B. The coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts) and for the total financial debt used, including bank credit, debt from other financial intermediaries and minibond issuances. We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firmlevel control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, indicate, respectively, statistical significance at 1, 5, 10 percent level.

Panel A. Firm-Bank Level Analysis

	Lendir	ng Rates	Lending Volumes				
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted		
Minibond * Post	-0.278***	-0.236***	-0.492***	-0.098	-0.091***		
Willioona Tost	[0.089]	[0.064]	[0.104]	[0.063]	[0.014]		
Firm Controls	YES	YES	YES	YES	YES		
Firm FE	YES	YES	YES	YES	YES		
Bank FE	YES	YES	YES	YES	YES		
Year FE	YES	YES	YES	YES	YES		
Observations	60685	49149	110582	217405	106831		
R-Squared	0.010	0.011	0.001	0.001	0.002		
No. Firms	2199	2342	2850	2889	2837		
No. Issuers	94	101	107	109	107		

Panel B. Firm Level Analysis

Tanet B. Tim Bever Analysis									
	Lendi	ing Rates		Lending Volum	es	Debt			
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	<b>Total Financial Debt</b>			
Minibond * Post	-0.257***	-0.433***	-0.347***	-0.104	-0.097***	0.412***			
	[0.092]	[0.121]	[0.130]	[0.064]	[0.019]	[0.093]			
Firm Controls	YES	YES	YES	YES	YES	YES			
Firm FE	YES	YES	YES	YES	YES	YES			
Year FE	YES	YES	YES	YES	YES	YES			
Observations	10679	11565	14110	14110	13979	14110			
R-Squared	0.040	0.050	0.012	0.015	0.011	0.012			
No. Firms	2216	2404	2850	2850	2837	2850			
No. Issuers	95	102	107	107	107	107			

#### Table C.3. Propensity Score Matching with Radius Matching

This table presents the results of the difference-in-differences regression for the changes in lending rates and volumes at the firm-bank level (panel A) and at the firm level (panel B) after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a propensity score matching (specification col. 1-2 in Table C.1), which uses a radius matching with replacement to select the controls in the propensity score radius of 0.00006 for each treated firm based on ex-ante firm-level characteristics. Each firm in the control group is assigned the same time of event of the corresponding matched treated firm. The regressions include bank, firm and year fixed effects in panel A, and firm and year fixed effects in panel B. The coefficient for the interaction between the first minibond issuance (Minibond) and the postissuance dummy (Post) defines the average treatment effect on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts) and for the total financial debt used, including bank credit, debt from other financial intermediaries and minibond issuances. We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \*\* indicate, respectively, statistical significance at 1, 5, 10 percent level.

Panel A. Firm-Bank Level Analysis

	Lendir	ng Rates		Lending Volumes	
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted
Minibond * Post	-0.267***	-0.283***	-0.457***	-0.060	-0.095***
	[0.096]	[0.072]	[0.098]	[0.060]	[0.015]
Firm Controls	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES
Observations	77934	58522	129085	249110	125440
R-Squared	0.007	0.011	0.001	0.000	0.001
No. Firms	3205	3240	3945	3996	3922
No. Issuers	79	86	90	92	90

Panel B. Firm Level Analysis

Tanci B. I II ii Ecvel Analysis								
	Lending Rates			Lending Volum	es	Debt		
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	<b>Total Financial Debt</b>		
Minibond * Post	-0.293***	-0.446***	-0.312***	-0.088	-0.094***	0.427***		
	[0.102]	[0.139]	[0.110]	[0.065]	[0.018]	[0.059]		
Firm Controls	YES	YES	YES	YES	YES	YES		
Firm FE	YES	YES	YES	YES	YES	YES		
Year FE	YES	YES	YES	YES	YES	YES		
Observations	15532	15853	19531	19531	19372	19531		
R-Squared	0.025	0.059	0.005	0.013	0.009	0.005		
No. Firms	3231	3307	3945	3945	3922	3945		
No. Issuers	80	87	90	90	90	90		

Table C.4. Propensity Score Matching with Lower Number of Control Firms:

5 Nearest Neighbor Firms

This table presents the results of the difference-in-differences regression for the changes in lending rates and volumes at the firm-bank level (panel A) and at the firm level (panel B) after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a propensity score matching (specification col. 1-2 in Table C.1), which uses a nearest neighbour algorithm with replacement to select the nearest 5 control firms for each treated firm based on ex-ante firm-level characteristics. Each firm in the control group is assigned the same time of event of the corresponding matched treated firm. The regressions include bank, firm and year fixed effects in panel A, and firm and year fixed effects in panel B. The coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts) and for the total financial debt used, including bank credit, debt from other financial intermediaries and minibond issuances. We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

Panel A. Firm-Bank Level Analysis

	Lendi	ng Rates		Lending Volume	es
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted
Minibond * Post	-0.280***	-0.230***	-0.531***	-0.094	-0.099***
	[0.088]	[0.059]	[0.101]	[0.058]	[0.014]
Firm Controls	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES
Observations	14146	12042	26131	50730	25260
R-Squared	0.016	0.016	0.004	0.001	0.007
No. Firms	494	532	631	643	627
No. Issuers	94	101	107	109	107

Panel B. Firm Level Analysis

	T 1		inci D. i ii iii	L. Vel Allalysi		D.14
	Lending Rates			Lending Volume	es	Debt
	Advances	Long-Term	Credit Used	<b>Credit Granted</b>	Used / Granted	Total Financial Debt
Minibond * Post	-0.270***	-0.426***	-0.391***	-0.120*	-0.105***	0.364***
	[0.092]	[0.119]	[0.129]	[0.068]	[0.018]	[0.096]
Firm Controls	YES	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	2408	2623	3129	3129	3099	3129
R-Squared	0.052	0.074	0.019	0.015	0.050	0.019
No. Firms	496	544	631	631	627	631
No. Issuers	95	102	107	107	107	107

Table C.5. Propensity Score Matching with Lower Number of Control Firms:

The Nearest Neighbor Firm

This table presents the results of the difference-in-differences regression for the changes in lending rates and volumes at the firm-bank level (panel A) and at the firm level (panel B) after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of a propensity score matching (specification col. 1-2 in Table C.1), which uses a nearest neighbour algorithm with replacement to select the nearest control firm for each treated firm based on ex-ante firm-level characteristics. The control firm is assigned the same time of event of the corresponding matched treated firm. The regressions include bank, firm and year fixed effects in panel A, and firm and year fixed effects in panel B. The coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts) and for the total financial debt used, including bank credit, debt from other financial intermediaries and minibond issuances. We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

Panel A. Firm-Bank Level Analysis

	Lendi	ng Rates		Lending Volume	es
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted
Minibond * Post	-0.326***	-0.248***	-0.584***	-0.092	-0.108***
	[0.089]	[0.051]	[0.107]	[0.057]	[0.014]
Firm Controls	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES
Observations	5513	5123	9936	19355	9639
R-Squared	0.025	0.021	0.011	0.001	0.021
No. Firms	177	190	212	217	209
No. Issuers	94	101	107	109	107

Panel B. Firm Level Analysis

	Lendi	ng Rates		Lending Volume	es	Debt
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	<b>Total Financial Debt</b>
Minibond * Post	-0.270***	-0.380***	-0.423***	-0.125	-0.117***	0.329***
	[0.088]	[0.118]	[0.131]	[0.079]	[0.018]	[0.104]
Firm Controls	YES	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	859	929	1047	1047	1032	1047
R-Squared	0.149	0.107	0.061	0.018	0.145	0.048
No. Firms	177	193	212	212	209	212
No. Issuers	95	102	107	107	107	107

# Table C.6. Propensity Score Estimated with Stricter Criteria: Matching with Nearest Neighbor

This table presents the results of the difference-in-differences regression for the changes in lending rates and volumes at the firm-bank level (panel A) and at the firm level (panel B) after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of the propensity score, estimated using stricter criteria as in col. 3-4 of Table C.1. The propensity score matching uses a nearest neighbour algorithm with replacement to select the 30 nearest control firms for each treated firm based on ex-ante firm-level characteristics. Each firm in the control group is assigned the same time of event of the corresponding matched treated firm. The regressions include bank, firm and year fixed effects in panel A, and firm and year fixed effects in panel B. The coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts) and for the total financial debt used, including bank credit, debt from other financial intermediaries and minibond issuances. We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

Panel A. Firm-Bank Level Analysis

	Lendi	ng Rates		Lending Volume	es
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted
Minibond * Post	-0.267***	-0.253***	-0.524***	-0.113*	-0.095***
	[0.091]	[0.064]	[0.102]	[0.062]	[0.014]
Firm Controls	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES
Observations	58063	46439	105741	206635	102272
R-Squared	0.009	0.011	0.001	0.001	0.001
No. Firms	2115	2227	2728	2759	2714
No. Issuers	94	101	107	109	107

Panel B. Firm Level Analysis

	Lendi	ng Rates		Lending Volume	es	Debt
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	Total Financial Debt
Minibond * Post	-0.297***	-0.447***	-0.387***	-0.121*	-0.101***	0.373***
	[0.093]	[0.122]	[0.127]	[0.063]	[0.018]	[0.091]
Firm Controls	YES	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	10281	10976	13531	13531	13412	13531
R-Squared	0.029	0.043	0.010	0.020	0.012	0.010
No. Firms	2128	2280	2728	2728	2714	2728
No. Issuers	95	102	107	107	107	107

# Table C.7. Propensity Score Estimated with Stricter Criteria: Matching with Radius Matching

This table presents the results of the difference-in-differences regression for the changes in lending rates and volumes at the firm-bank level (panel A) and at the firm level (panel B) after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of the propensity score, estimated using stricter criteria as in col. 3-4 of Table C.1. The propensity score matching uses a radius matching algorithm with replacement to select the control firms in the propensity score radius of 0.00006 for each treated firm based on ex-ante firm-level characteristics. Each firm in the control group is assigned the same time of event of the corresponding matched treated firm. The regressions include bank, firm and year fixed effects in panel A, and firm and year fixed effects in panel B. The coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts) and for the total financial debt used, including bank credit, debt from other financial intermediaries and minibond issuances. We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

Panel A. Firm-Bank Level Analysis

	Lendi	ng Rates		Lending Volume	es
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted
Minibond * Post	-0.223***	-0.320***	-0.536***	-0.123	-0.099***
	[0.083]	[0.079]	[0.130]	[0.078]	[0.017]
Firm Controls	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES
Observations	54226	41477	89292	172170	86836
R-Squared	0.010	0.016	0.001	0.000	0.002
No. Firms	2109	2116	2539	2581	2523
No. Issuers	65	70	74	76	74

Panel B. Firm Level Analysis

	Lendi	ng Rates		Lending Volume	es	Debt
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	Total Financial Debt
Minibond * Post	-0.222**	-0.475***	-0.388***	-0.130	-0.097***	0.444***
	[0.104]	[0.147]	[0.144]	[0.079]	[0.022]	[0.069]
Firm Controls	YES	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	10223	10366	12552	12552	12440	12552
R-Squared	0.032	0.073	0.006	0.014	0.013	0.006
No. Firms	2117	2162	2539	2539	2523	2539
No. Issuers	66	71	74	74	74	74

# Table C.8. Propensity Score Estimated with Stricter Criteria: Matching with Lower Number of Control Firms (5 Nearest Neighbor)

This table presents the results of the difference-in-differences regression for the changes in lending rates and volumes at the firm-bank level (panel A) and at the firm level (panel B) after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of the propensity score, estimated using stricter criteria as in col. 3-4 of Table C.1. The propensity score matching uses a nearest neighbour algorithm with replacement to select the 5 nearest control firms for each treated firm based on ex-ante firm-level characteristics. Each firm in the control group is assigned the same time of event of the corresponding matched treated firm. The regressions include bank, firm and year fixed effects in panel A, and firm and year fixed effects in panel B. The coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts) and for the total financial debt used, including bank credit, debt from other financial intermediaries and minibond issuances. We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

Panel A. Firm-Bank Level Analysis

	Lendi	ng Rates		Lending Volume	es
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted
Minibond * Post	-0.292***	-0.240***	-0.511***	-0.096	-0.096***
	[0.090]	[0.058]	[0.103]	[0.060]	[0.014]
Firm Controls	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES
Bank FE	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES
Observations	14326	11910	26593	52560	25703
R-Squared	0.014	0.014	0.003	0.000	0.007
No. Firms	507	536	634	642	630
No. Issuers	94	101	107	109	107

Panel B. Firm Level Analysis

1 11111 20 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1							
	Lendi	ng Rates		Lending Volume	es	Debt	
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	Total Financial Debt	
Minibond * Post	-0.257***	-0.419***	-0.385***	-0.125*	-0.105***	0.369***	
	[0.092]	[0.119]	[0.125]	[0.067]	[0.018]	[0.093]	
Firm Controls	YES	YES	YES	YES	YES	YES	
Firm FE	YES	YES	YES	YES	YES	YES	
Year FE	YES	YES	YES	YES	YES	YES	
Observations	2493	2641	3152	3152	3125	3152	
R-Squared	0.087	0.059	0.029	0.022	0.066	0.030	
No. Firms	509	550	634	634	630	634	
No. Issuers	95	102	107	107	107	107	

# Table C.9. Propensity Score Estimated with Stricter Criteria: Matching with Lower Number of Control Firms (The Nearest Neighbor)

This table presents the results of the difference-in-differences regression for the changes in lending rates and volumes at the firm-bank level (panel A) and at the firm level (panel B) after the issuance of minibonds. The treatment corresponds to the first issuance of a minibond. The control sample includes ex-ante comparable non-issuer firms identified on the basis of the propensity score, estimated using stricter criteria as in col. 3-4 of Table C.1. The propensity score matching uses a nearest neighbour algorithm with replacement to select the nearest control firm for each treated firm based on exante firm-level characteristics. Each control firm is assigned the same time of event of the corresponding matched treated firm. The regressions include bank, firm and year fixed effects in panel A, and firm and year fixed effects in panel B. The coefficient for the interaction between the first minibond issuance (Minibond) and the post-issuance dummy (Post) defines the average treatment effect on the lending rates for advances and long-term loans, and on credit volumes for used and granted bank credit, for the ratio between used and granted bank credit (for all the types of credit contracts) and for the total financial debt used, including bank credit, debt from other financial intermediaries and minibond issuances. We consider two quarters before the first issuance by firm (Post=0), against the quarter of the issuance and the following two quarters (dummy Post=1). The issuance period considered in the estimates is between the fourth quarter of 2012 and the end of 2016; the overall sample period consider data between June 2012 up until June 2017. The lending rates are expressed in percent rates. The regression specification includes also the one-year lagged firm-level control variables (total assets, leverage and Z-Score). Standard errors are clustered at firm level. Regressions are weighted with CEM strata weights. \*\*\*, \*\*, \* indicate, respectively, statistical significance at 1, 5, 10 percent level.

Panel A. Firm-Bank Level Analysis

	Lendi	ng Rates	Lending Volumes			
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	
Minibond * Post	-0.292***	-0.240***	-0.511***	-0.096	-0.096***	
	[0.090]	[0.058]	[0.103]	[0.060]	[0.014]	
Firm Controls	YES	YES	YES	YES	YES	
Firm FE	YES	YES	YES	YES	YES	
Bank FE	YES	YES	YES	YES	YES	
Year FE	YES	YES	YES	YES	YES	
Observations	14326	11910	26593	52560	25703	
R-Squared	0.014	0.014	0.003	0.000	0.007	
No. Firms	507	536	634	642	630	
No. Issuers	94	101	107	109	107	

Panel B. Firm Level Analysis

	Lending Rates			Lending Volume	Debt	
	Advances	Long-Term	Credit Used	Credit Granted	Used / Granted	Total Financial Debt
Minibond * Post	-0.257***	-0.419***	-0.385***	-0.125*	-0.105***	0.369***
	[0.092]	[0.119]	[0.125]	[0.067]	[0.018]	[0.093]
Firm Controls	YES	YES	YES	YES	YES	YES
Firm FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Observations	2493	2641	3152	3152	3125	3152
R-Squared	0.087	0.059	0.029	0.022	0.066	0.030
No. Firms	509	550	634	634	630	634
No. Issuers	95	102	107	107	107	107