Securities Lending and Corporate Financing: Evidence from Bond Issuance

Jennie Bai^{*}, Massimo Massa[†], Hong Zhang[‡]

June 2021

Abstract

The securities lending market allows institutional investors, such as insurance companies, to lend out asset holdings in exchange for cash collateral, an important but understudied source of funding. Since securities lenders are also primary investors in corporate bonds, we hypothesize that their lending preference for certain types of bonds can influence corporate financing policies. Indeed, we observe that a higher lender preference for long-term bonds stimulates firms to issue more such bonds and helps boost bond prices. The analysis exploiting a quasi-experiment supports a causal interpretation. Our results shed new light on the potential impact of securities lending.

Keywords: securities lending, institutional investors, cost of capital, bond issuance, bond

pricing.

JEL Codes: G12, G22, G23, G32

We thank Jaewon Choi, James Choi, Darrell Duffie, Andrew Ellul, Robert Engle, Nicolae Gârleanu, Bing Han, Jingzhi Huang, Sibo Liu (SFS discussant), Zhan Shi, Matthew Spiegel, Laura Starks, Heather Tookes (AFA discussant), Eliza Wu, Xiaoneng Zhu, and seminar and conference participants at INSEAD, Georgetown University, PBCSF at Tsinghua University, the 2019 American Finance Association (AFA) Meeting, the Society of Financial Studies (SFS) Cavalcade Asia-Pacific 2019, and the Corporate Finance Day at Antwerp for helpful comments.

^{*}McDonough School of Business, Georgetown University, 3700 O St, Washington, DC 20057, and NBER; Email: jennie.bai@georgetown.edu.

[†] INSEAD, 1 Ayer Rajah Avenue, Singapore 138676; E-mail: massimo.massa@insead.edu.

[‡] PBC School of Finance, Tsinghua University, 43 Chengfu Road, Haidian District, Beijing, PR China 100083, Email: <u>zhangh@pbcsf.tsinghua.edu.cn.</u>

Securities Lending and Corporate Financing: Evidence from Bond Issuance

Abstract

The securities lending market allows institutional investors, such as insurance companies, to lend out asset holdings in exchange for cash collateral, an important but understudied source of funding. Since securities lenders are also primary investors in corporate bonds, we hypothesize that their lending preference for certain types of bonds can influence corporate financing policies. Indeed, we observe that a higher lender preference for long-term bonds stimulates firms to issue more such bonds and helps boost bond prices. The analysis exploiting a quasi-experiment supports the causal interpretation. Our results shed new light on the potential impact of securities lending.

Keywords: securities lending, institutional investors, cost of capital, bond issuance, bond pricing.

JEL Codes: G12, G22, G23, G32

Over recent decades, the securities lending market has grown substantially with a \$16 trillion lendable inventory and a \$2 trillion lending amount as of 2018. This rapid growth has sparked interest in the economic implications of securities lending. Vast evidence shows, for instance, that the presence of the securities lending market can help improve market efficiency (e.g., Ljungqvist and Qian, 2013; Drechsler and Drechsler, 2016) and exert real influence on investment and corporate governance (e.g., Grullon, Michenaud, and Weston, 2015; Fang, Huang, and Karpoff, 2016).

These studies on securities lending focus on the activities and influence of securities *borrowers*, notably short-sellers, whereas the role played by securities *lenders* has been much less explored. This research gap is probably due to the limited role played by securities lenders in the equity lending market (e.g., index funds passively lend out stocks for fees). However, it is difficult to extend a similar argument to the corporate bond lending market. Indeed, a striking feature of the corporate bond market is the lack of intensive informed short-selling (Asquith, Au, Covert, and Pathak, 2013), which gives rise to drastically different incentives for lenders and borrowers to participate in bond lending (Foley-Fisher, Narajabad, and Verani, 2019).¹

A telling example of the incentives of bond lenders can be found in the period of the Great Recession of 2007-2009. Up to the crisis, insurance companies such as AIG, which played a dual role as both the primary *investors* in the corporate bond cash market and the main *lenders* in the corporate bond lending market, relied heavily on the lending market to expand their balance-sheet transactions. For instance, they lent bonds in exchange for cash collateral posted by bond borrowers and resorted to *collateral management*—i.e., reinvestment of cash collateral in other securities in off-balance-sheet transactions—to achieve certain goals such as yield enhancement and asset/liability management (Peirce, 2014; McDonald and Paulson, 2015).²

¹ Borrowers often borrow corporate bonds for noninformation reasons, ranging from inventory management or market-making to regulatory arbitrage (Foley-Fisher, Narajabad, and Verani, 2019, provide detailed discussions and references). Unlike the lending market for equities or government bonds, the corporate bond lending market is hardly affected by motivations such as dividend arbitrage, voting rights (Aggarwal, Saffi, and Sturgess, 2016), or flight to safety (Aggarwal, Bai, and Laeven, 2020).

² As documented in Peirce (2014) and McDonald and Paulson (2015), AIG and its life insurance subsidiaries had reinvested its cash collateral in riskier long-term assets such as residential mortgage-backed securities, resulting in a large exposure to toxic securities during the subprime crisis. At the height of the crisis, the program experienced a run, and AIG could not meet the repayment demands. The losses in the securities lending program were severe and played a major role in AIG's collapse. While the aggressive practice of AIG is extreme, it offers an example of active collateral management. Fostel and Geanakoplos (2014) provide a review of collateral equilibrium. More practical issues related to collateral management can be found in a sponsored statement from JP Morgan (2006, "Securities Lending: An Asset/Liability Business").

While the practice of AIG turned out to be controversial, collateral management is widespread among insurance companies and other bond investors, such as mutual funds and pension funds (see, e.g., JP Morgan, 2006). Such observations highlight a more active role that bond lenders play, which may provide new mechanisms through which the securities lending market can influence the economy in a way unnoticed by the existing literature.

In this paper, we explore one such new mechanism by asking whether the dual lenderinvestor role played by financial intermediaries may allow the bond lending market to influence corporate financing policies. Our key intuition is that when certain types of corporate bonds are preferred by lenders in the lending market (e.g., for the purpose of collateral management), lenders may condition their purchases in the bond market on their lending needs. In this case, a high willingness among lenders to lend out certain types of bonds in the lending market, which we refer to as *lender preference*, can spill over to the cash bond market to influence bond prices and incentivize companies to issue similar bonds. This mechanism differs from the information channel through which the stock lending market exerts an influence on corporate policies; it also differs from the traditional view that corporate financing policies and bond prices are mostly determined by firm fundamentals.³

We test this intuition by exploiting the U.S. corporate bond lending market with 16 million corporate bond loan records from 2005 to 2014. In the spirit of Greenwood, Hanson, and Stein (2010), we focus on one important features of bonds in gauging the potential influence of the lending market: bond maturity. Bond maturity is especially suitable for our purposes since it plays a key role in corporate decisions and can be influenced by creditors or capital supply in the primary bond market (e.g., Roberts and Sufi 2009; Custodio, Ferreira, and Laureano 2013). Moreover, bond maturity is highly relevant to the bond lending market (Asquith, Covert and Patak, 2013) and is one of the most important considerations in collateral management (JP Morgan, 2006). Both yield enhancement and asset/liability management, the two prominent goals of collateral management, involve maturity as a first-order bond characteristic.

We accordingly construct two measures of lender preference over maturity. The first measure is the total lendable amount of a firm's long-term bonds scaled by their outstanding

³ We do not claim that *lender preference* reflects only considerations related to collateral management; it may well be influenced by other purposes of lenders and by equilibrium conditions of the lending market. Rather, we use this channel to demonstrate the potential influence of securities lending when informed short-selling is *not* involved.

amount. To capture the aggregate lender preference, the second measure is defined at the market level as the ratio between the aggregate value of lendable long-term corporate bonds in the whole market and the total value of long-term bonds outstanding. Both measures capture lenders' willingness to lend out long-term bonds: a higher lendable ratio indicates a higher revealed preference of lenders to use long-term bonds to, among other things, achieve the goal of collateral management. Building upon these measures, we can explicitly test our previous intuition by investigating whether fluctuations in lender preference for long-term bonds affect the issuance and pricing of such bonds.

To set the stage, we provide two diagnostic analyses to shed light on the incentives and preferences of bond lenders before we conduct formal tests. We first show that bond lenders have a general preference for long-term bonds and accept lower lending fees to lend out such bonds.⁴ Indeed, bond lenders are often willing to accept *negative* lending fees (i.e., they essentially pay the borrowers a financing cost to receive cash collateral), which can be rationalized only by collateral management. That is, the benefits of reinvested cash collateral must outweigh the cost to justify this practice. The popularity of negative lending fees (approximately 27% in the sample) highlights the importance of collateral management in understanding the incentive difference between bond and stock lenders.

Second, if yield enhancement is a prime component of collateral management, we should expect a direct link between the yield-enhancement incentive of bond investors and their willingness to participate in the lending market as lenders. To potentially detect—or reject—this link, we leverage the intuition that holding bonds with reaching-for-yield (RFY) properties reflects the yield-enhancement incentive of bond investors (e.g., Becker and Ivashina, 2015; Choi and Kronlund, 2017). Empirically, we find that high-RFY institutional investors (e.g., insurance companies and mutual funds) do indeed lend out more bonds than low-RFY investors. Moreover, when holdings of long-term bonds by high-RFY investors increase, future lending activities increase. Jointly, our diagnostic analyses indicate that bond lenders' preference is

⁴ More explicitly, bond maturity is positively related to lendable and lending amount and negatively related to lending fee. In other words, long-term bonds are what bond lenders supply the most (high lendable amount) while they are willing to accept a lower lending fee. In the spirit of Cohen, Diether, and Malloy (2007), this empirical pattern suggests that lenders actively lend out long-term bonds instead of short-sellers requesting these bonds, because the latter case will lead to high lending fees. Consistent with this notion, Bai (2018) and Anderson, Henderson, and Pearson (2018) show that the informed shorting demand in the corporate bond lending market is captured exclusively by a combination of high lending fee and high lendable (lending) amount.

more aligned with the benefits of collateral management than with passively receiving lending fees.⁵

Armed with these preliminary findings, we investigate the impact of lender preference on corporate financing policies. Following Greenwood, Hanson, and Stein (2010), we create a proxy for the firm's choice of issuing long-term bonds (*long-term bond issuance*) and regress it on lender preference for existing long-term bonds and a set of control variables. In the panel analysis, we show that a one standard deviation increase in the firm-level lender preference for long-term bonds increases the probability of long-term bond issuance in the next year by 3.44%~5.12%. Given that the average annual long-term bond issuance rate is 14.3%, lender preference plays a noticeable role in driving the future bond issuance decision.

If the above relationship is channeled through dual lender-investors, a higher lender preference for long-term bonds should also transmit to higher investor demand, leading to lower expected return and higher bond prices for similar bonds in the secondary market. Indeed, we document an economically and statistically significant relationship between lender preference and bond pricing. A one standard deviation increase in lender preference is related to approximately 0.32% lower future bond yield spreads and approximately 0.41% lower expected monthly bond return. Given that the average bond yield spread and bond return are 2.50% and 0.73%, respectively, the impact of lender preference on bond pricing is economically influential.

It is important to note that the positive impact of securities lending on bond prices is novel to the short-selling literature and contradicts the conventional finding in the equity lending market. Indeed, informed short-selling typically translates into *lower* future stock prices when short sellers process negative information about firms. Thus, although more informed short selling can induce lenders to supply more lendable shares in the equity market, this traditional mechanism is unlikely to generate a *positive* relationship between lendable supply and bond prices.

To further establish lender preference as an independent channel influencing bond issuance, we exploit one regulatory experiment that exogenously impacted the preferences of corporate

⁵ It is difficult to sketch the asset/liability side of collateral management because primary institutional investors are not required to disclose their reinvested portfolio. A noticeable exception is the 2010 regulation requesting insurance companies to disclose such off-balance-sheet transactions, which we will discuss shortly.

bond lenders. In 2010, the National Association of Insurance Commissioners (NAIC) required insurance companies to disclose their engagement in the securities lending market and report information on both their securities lending and reinvestment of the lending proceeds. This requirement reduced the incentive of insurance companies to engage in securities lending and collateral management for several reasons. First, disclosure can in general be costly (e.g., Goldstein and Yang 2019). Second, the new regulation reduced the incentive to exploit collateral management and its associated off-balance-sheet assets as a tool to avoid regulatory constraints (e.g., AIG reinvested cash collateral in toxic securities during the subprime crisis). Finally, the new regulation made the reputation risk even starker for insurance companies in terms of being publicly associated with short-sellers who were blamed for depressing securities prices and interfering in the market. It is worth noting that the same policy should have differential influences on bonds with different ownership. The policy shock should have disrupted the lending activities more for bonds held by insurance companies than for bonds held by other owners.

We execute this identification strategy by using insurance companies' bond holding information to proxy for their lender preference and interacting this variable with the NAIC regulation shock. Although bond holding is endogenously related to lender preference, its interaction with the regulation shock provides a reasonable instrument for the exogenous shock to the lendable amount that insurance companies were willing to provide to the lending market in the post-policy period. Following this intuition, we conduct a two-stage instrument variable test and the test confirms our main results.

After mitigating the potential endogeneity concern, we conduct a list of additional analyses and robustness checks. First, to highlight the possibility that lender-investors may use the securities lending market to obtain funding for collateral management, we examine the subsample of bond lending activities for which lending fees are negative. This subsample is important because, as discussed, lenders' willingness to essentially *pay* borrowers in exchange for cash collateral reveals the value of the latter to lenders in their collateral management. We find a more significant influence of lender preference in this subsample: a one standard deviation increase in lender preference for bonds with a negative lending fee elevates the probability of long-term bond issuance in the next year by an additional 1.20% and lessens future bond yield spreads by an additional 0.23% and future bond return by an additional 0.31%. This result confirms the key role that collateral management plays in shaping the preference of dual lender-investors and, subsequently, firms' financing decisions.

Second, we show that our results hold for nonfinancial firms, suggesting that the influence of lender preference goes far beyond the financial industry. Third, we consider alternative proxies of lender preference, with *lending* amount substituting *lendable* amount in the original proxies. We show that the alternative lending-based measure of lender preference has the similar influence on bond issuance and bond pricing as the original lendable-based proxy. Last, we verify that covenants do not affect the relationship between lender preference and debt maturity choices or bond financing. This observation further alleviates the concern of a spurious correlation related to bond characteristics.

Overall, our results suggest that lender preference for corporate bonds affects bond prices and corporate financing decisions. Lender preference can fluctuate when the benefits and costs of collateral management and its regulations vary over time. Once such fluctuation emerges, it spills over to the primary and secondary corporate bond market and subsequently influence the debt issuing choices of firms. These observations reveal a novel lender-initiated channel through which securities lending can influence corporate policies in the real economy.

Our findings contribute to several strands of the literature. First, our work is closely related to studies exploring the real impact of the securities lending market. The common economic basis for the known impacts, such as improved corporate governance, is informed short-selling, which punishes misconduct by firms through downward price pressure.⁶ Our main contribution is to propose a novel mechanism related to dual investor-lenders' collateral management incentive, which allows the bond lending market to influence corporate policies in the real economy without processing superior (and negative) information about firms. Different from the channel of informed short-selling, increased securities lending in this mechanism translates into higher prices to influence corporate debt policies. These results echo the importance of the lender's perspective (Foley-Fisher, Narajabad, and Verani, 2019), as a complement to the short-seller focus of the literature, for understanding the economics of the securities lending market.

In exploring the lender-investor mechanism, we also provide the first evidence, to the best

⁶ See, among others, the studies showing that equity short-sellers may help improve market efficiency (e.g., Ljungqvist and Qian, 2013; Jiao, Massa, and Zhang, 2016; Drechsler and Drechsler, 2016; Bai, 2018) and corporate governance (e.g., Massa, Zhang, and Zhang, 2015; Fang, Huang, and Karpoff, 2016).

of our knowledge, of how corporate financing decisions can be influenced by the bond lending market. There are a number of prominent theories explaining corporate debt choices by focusing on firm fundamentals and relevant market conditions, with more recent explanations also emphasizing the importance of filling the gap in the maturity structure of government debt (Greenwood, Hanson, and Stein, 2010; Badoer and James, 2016) and the potential influence of bond fund flows (Choi et al., 2019; Zhu 2020; Ben-Rephael, Choi, and Goldstein, 2020).⁷ We extend this line of research by demonstrating that corporate financing decisions can be influenced by lender preference, which may not have a direct relationship with firm fundamentals.⁸

Lastly, our results provide a new perspective on bond pricing. There is little consensus on the cross-sectional determinants of bond yield spreads in the empirical asset pricing literature. Existing studies conventionally focus on default risk, liquidity risk, tax, and jump risk, all measured in the secondary bond market.⁹ Our paper instead studies bond pricing by linking the primary and secondary bond markets to the bond lending market. What differentiates our paper is that we explore the novel channel related to the collateral management incentives of lenders. In a sense, we show that the collateral value of a bond—reflected in lender preference—affects its price, which adds to our understanding of the asset pricing role played by collateral (e.g., Duffie 1996; Kiyotaki and Moore, 1997; Brunnermeier and Pedersen, 2009).

I. Data and Main Variables

To examine the impact of lender preference on bond issuance and bond pricing, we compile four types of corporate bond information: bond lending transactions, bond issuance, bond

⁷ For instance, firm characteristics such as credit ratings, probability of default, riskiness, tangibility of assets, and cash flows (e.g., Diamond, 1991; Rajan, 1992; Houston and James, 1996; Cantillo and Wright, 2000; Denis and Mihov, 2003; Guedes and Opler, 1996) and market conditions related to the term structure of interest rates (Barclays and Smith, 1995) are shown to be important to the financing choices of firms. More recent explanations also include multimaturity niche-filling targeting the informational needs of institutional investors (Dass and Massa, 2013) and market frictions (Choi, Hackbarth, and Zechner, 2018).

⁸ Although lender preference spills over to the cash bond market through demand, its impact differs from that of outright demand shocks originated from bond fund flows. Indeed, the flows of bond mutual funds affect bond issuance (Zhu 2020) but not bond prices (Choi et al., 2019), whereas lender preference influences both.

⁹ The bond pricing literature is extensive, with contributions from, to cite a few, Collin-Dufresne, Goldstein, and Martin (2001); Bessembinder, Maxwell and Venkataraman (2006); Bessembinder and Maxwell (2009); Greenwood and Vayanos (2008); Bai and Wu (2016); Lin, Wang and Wu (2010); and Bai, Collin-Dufresne, Goldstein, and Helwege (2016).

trading records, and bond holding information, for the sample period of January 2005 to December 2014. We now explain these data and our main variables in detail.

A. Corporate Bond Data

We first obtain corporate bond lending data from Markit. This data company collects daily securities lending information from large custodians and prime brokers and covers more than 85% of the securities lending market. We merge the bond lending data with the Mergent Fixed-Income Securities Database (FISD) to obtain bond characteristics such as offering amount, offering date, maturity date, coupon, coupon type, bond type, bond option features, and issuer information. To clean the corporate bond lending data, we adopt the following filtering criteria: (i) we remove bonds issued by firms not in the jurisdiction of the United States and bonds not issued in the currency of U.S. dollars; (ii) we remove bonds that are structured notes or mortgage-backed, asset-backed, agency-backed or equity-linked; and (iii) we remove convertible bonds since this option feature adds noise to bond pricing.

After identifying the list of eligible corporate bonds, we collect their lending transaction records for the sample period of January 2005 to December 2014. Among 68,197 nonconvertible corporate bonds with maturity dates later than January 2005 in the Mergent bond issue data, 26,653 bonds (39%) have lending transaction records in the Markit bond lending data. We further remove records with missing or zero lendable amounts as well as records that have lending amounts greater than the lending inventory or bond outstanding amount. To eliminate the impact of noisy lending records, we winsorize the ratio of the lendable amount to the bond outstanding amount at the 0.5% level, resulting in a sample of 19.6 million bond-day lending transaction records for 26,487 bonds issued by 4,509 firms. In the next subsection, we aggregate the data to the firm level at monthly or annual frequency, depending on the test requirements, to construct the primary independent variable, *lender preference*.

To examine the relationship of lender preference and bond issuance as well as bond pricing, we also need bond issuance data and bond pricing data. The issuance data come from the Mergent FISD. There are 33,918 corporate bonds qualifying under the above bond filtering criteria, which are issued by 3,244 firms from January 2005 to December 2014. We aggregate the bond-level issuance to the firm-year level to remove any seasonality in the bond issuance, which we discuss in the next subsection.

For bond pricing information, we download corporate bond transaction data from the

enhanced version of the Trade Reporting and Compliance Engine (TRACE) for the same sample period of January 2005 to December 2014. The enhanced TRACE dataset offers the best quality data on corporate bond transactions, with intraday observations on price, trading volume, and buy and sell indicators. To construct bond returns and bond yield spreads in an accurate manner, we follow the rules proposed by Bai, Bali, and Wen (2019). In short, we keep only corporate bonds that are traded in the U.S. public market and that are issued by a U.S. firm and have the currency of the U.S. dollar. The qualified bonds need to be non-convertible, have non-floating coupons, and have reasonable prices (between \$5 and \$1,000) and reliable trading volumes (larger than \$10,000). The final bond pricing data include 11 million bond-day observations for 43,542 bonds issued by 4,596 firms. We merge them with corporate bond lending data and keep bonds with both trading and lending records, resulting in a sample of 16,546 unique bonds issued by 3,393 firms. In the next subsection, we construct bond yield spreads and bond returns at monthly frequency and aggregate them to the firm level by maturity niche.

Finally, we collect corporate bond holding data from the Thomson Reuters eMaxx dataset to construct instrumental variables. We apply the same filtering criteria used for the bond lending data to select qualified bonds in the eMaxx data. Given the nature of the regulation event studied in the paper, we focus primarily on corporate bonds held by insurance companies, which are also predominant investors in the corporate bond market. The eMaxx data report for each insurance company the bond-level holding amounts, which we aggregate to the firm level across all insurance companies by maturity niche. We also consider corporate bonds held by mutual funds, the second largest bond investors and active bond lenders, when we explore the relationship between securities lending and the yield-enhancement incentives of bond lenders.

Table 1 presents the bond characteristics in the lending market and the primary and secondary bond markets. There are 26,487 active bonds in the lending market, 43,542 active bonds in the secondary market, and 33,918 newly issued bonds during our sample period of 2005-2014. Bonds in the lending market, on average, tend to have a larger size, longer maturity, and lower credit rating than those in the primary market but are not much different from those in the secondary market.

The most interesting observation in the table is the popularity of bond lending transactions with negative fees. In our sample, approximately 27% of bonds are ever lent (i.e., on loan) for negative fees. In addition, compared to the bonds on loan overall, such bonds tend to have an

even larger size and a longer maturity; they also have a better rating (A-, with a numeric value of 7) than that of the overall bonds on loan (BBB, with a numeric value of 9). In terms of collateral management, negative lending fees can be interpreted as the financing cost that lenders pay to borrowers to receive cash collateral. More generally speaking, lenders can reinvest these cash collateral in other assets to cover this cost (i.e., yield enhancement) or to achieve alternative goals (e.g., asset-liability matching).

B. Main Variables

Our first primary dependent variable is the *long-term bond issuance*, defined as a dummy variable that equals to 1 if firm *i* issues one or more long-term bonds in a given year *t*. While some literature examines the difference between long-term and short-term bonds using the cutoff time-to-maturity of one year, it is important for our study to adopt a cutoff point that matches lenders' differential preference on bond maturity. As we will discuss in Section II, diagnostic tests suggest that lender preference concentrates on bonds with remaining maturities of seven years and longer. Therefore, we refer to bonds with more than seven years remaining to maturity as long-term bonds.

Consequently, we divide bonds into two groups according to the maturity cutoff of seven years to examine how the changes in lender preference influence corporate decisions in issuing bonds with similar features. The notion of long-term bonds is adopted to provide a benchmark based on lenders' maturity preference; it has a specific and thus a relative meaning for the securities lending market. Likewise, the variable *long-term bond issuance* aims to capture the desire of firms to fill the gap when lenders' maturity preference fluctuates. Thus, this variable may not apply to the issuance of long-term bonds in other scenarios.

The second primary dependent variable is bond pricing, for which we consider both bond yield spread and corporate bond return. We calculate the daily yield to maturity for each bond based on bond characteristics (coupon rate, coupon frequency, coupon payment dates, bond maturity date) as well as bond trading prices on days when a bond is traded. We then deduct from the yield to maturity the duration-matched Treasury bond yield to obtain the daily bond yield spread. For monthly yield spreads, we take the end-of-month values if a bond is traded within the last 10 days of a particular month. We construct monthly corporate bond returns following Bai, Bali, and Wen (2019). Last, we aggregate the bond-level yield spreads and returns to the firm level by taking the average across bonds in the long-term maturity niche,

weighted by the bond outstanding amount. We call the first pricing variable the *long-term yield spread* and the second variable the *long-term bond return*.

Our main explanatory variable is *lender preference*. We consider two proxies for it. The first one is constructed at the firm level and is defined as the total lendable amount of firm *i*'s long-term corporate bonds scaled by this firm's total outstanding amount of long-term bonds (*long-term bond lendable-Firm*). The second proxy is constructed at the market level and is defined as the total lendable amount of long-term corporate bonds in the whole market scaled by these bonds' total outstanding amount (*long-term bond lendable-Mkt*). The intuition behind these two variables is that a higher lendable amount proxies for a higher possibility for lenders to lend out certain types of bonds in exchange for cash collateral. We use two measures because, in general, collateral management can be conducted via bonds issued by a particular firm or bonds from all firms.

C. Control Variables

We consider five sets of control variables that may affect bond issuance and bond pricing. The first set consists of two variables addressing the gap-filling hypothesis advanced in Greenwood, Hanson, and Stein (2010): *long-term Treasury outstanding*, which is the outstanding amount of long-term government bonds scaled by the total outstanding amount of government bonds at the end of each month, and *long-term bond outstanding-Mkt*, which is the outstanding amount of long-term corporate bonds scaled by the total outstanding amount of corporate bonds at the end of each month. They capture how much the long-term maturity niche is saturated by either government bonds or corporate bonds.

The second type of control variables addresses the potential effect posited by the preferred habitat hypothesis. The literature has argued for a long time that investors prefer a specific maturity niche (e.g., Schaefer, 1982). The amount of existing bonds in a specific maturity niche proxies for the decision of the firm to fill the niche. To control for the preferred habitat effect, we construct the firm-level variable *long-term bond outstanding-Firm*, which is firm *i*'s outstanding amount of long-term bonds scaled by its total outstanding amount of bonds at the end of each month.

The third type of control variable is linked to the equity market and, in particular, to the existence of information efficiency in the equity market. It has been shown that short-selling increases liquidity and makes the market more informationally efficient (e.g., Saffi and

Sigurdsson, 2011). We define the variable *equity lendable* as the total amount of firm *i*'s stocks that are available for lending in the equity lending market scaled by the firm's market capitalization at the end of each month. This variable captures the degree of efficiency in the equity market in terms of actual short-selling. It also controls for spurious effects coming from the equity lending market.

Next, we control for bond trading liquidity. The variable *long-term bond liquidity* captures the relative liquidity advantage of the specific maturity niche. It is defined as the average liquidity of long-term corporate bonds scaled by the average liquidity of all bonds in month t issued by the same firm. This indicator of bond-level liquidity is based on the liquidity measure in Amihud and Mendelson (2012) applied to corporate bond transactions.

Last, we consider a set of firm characteristics that potentially affect corporate financing decisions. Given that our focus is on the choice of debt maturity, we want to control for what the literature has identified as potential drivers of corporate debt maturity. These variables include the leverage ratio (*LEV*), the logarithm of the firm's total assets (*SIZE*) to proxy for the pecking order theory, the book-to-market ratio (*B/M*) to proxy for the market timing theory, the return on assets (*ROA*), and Standard & Poor's long-term firm-level rating (*RATING*) to proxy for the effect of credit risk as highlighted by the trade-off theory. We also add the amount of cash and tangible assets of the firm (*TAN*) to proxy for transparency, the collateral value of assets, and the dispersion of analyst forecasts for the firm (*DISP*) as an additional proxy for transparency. All variables are calculated from inputs in Compustat at the annual frequency from 2004 to 2013.

D. Summary Statistics

We report the summary statistics of the main variables and control variables in Table 2. In addition to full-sample descriptions, we also provide summary statistics across subsample periods determined by the NBER business cycle. We find that the average long-term bond issuance is relatively stable across the subsample periods. We also find that bond yield spreads were generally low before the financial crisis (1.542%), jumped up during the crisis of December 2007 to June 2009 (5.007%) and dropped again after the crisis (2.358%). The percentage of long-term bonds outstanding out of all bonds outstanding barely changed across subsample periods at either the market level (approximately 35%) or the firm level (46%).

12

The percentage of long-term bonds available for lending scaled by their outstanding amount is about 21% (19%) for the firm-level (market-level) values in the full sample, comparable to the 22% lendable share observed in the equity market. Perhaps not surprisingly, lendable shares in both markets increase during the crisis period (compared to the pre-crisis period). But the bond-market variation is much smaller than the equity market, consistent with the notion of potentially different mechanisms applying to bond and equity lending. Finally, both bond and equity lending markets witness increases in lendable shares from pre-crisis to post-crisis. But, again, the bond lending market appears more stable (lendable increases from 19% to 21%) than equity lending (lendable increases from 16% to 24%).

II. Diagnostic Analysis on the Preference of Lenders

In the U.S. securities lending market, lenders temporarily remise ownership of a security in exchange for collateral, which is usually cash, and receive a lending fee. The borrower is entitled to the economic benefits associated with ownership, e.g., dividends, coupons, etc., but is under a contractual obligation to make ("manufacture") equivalent payments back to the lender. The securities lending transaction can originate either with borrowers or with lenders. Typically, broker-dealers or custodian banks such as State Street are used as intermediaries in lending transactions. Borrowers in the bond lending market are often hedge funds and brokers, while lenders are institutional investors such as insurance companies and mutual funds. When lenders receive cash collateral, they reinvest it for yield-enhancement or risk-management purposes.

Early studies about the securities lending market typically took the perspective of borrowers (e.g., Duffie, Gârleanu, and Pedersen, 2002).¹⁰ In contrast, practitioners have long recognized the importance of the other side of the bond lending market—lenders and their collateral management (e.g., JP Morgan, 2006). Witnessing the disastrous outcome of AIG during the Great Recession (Peirce, 2014; McDonald and Paulson, 2015), more recent academic literature has also started to explore the economic role played by lenders. Foley-Fisher, Narajabad, and Verani (2019), for instance, show that insurance companies lend

¹⁰ Borrowers may need specific securities to bet on a negative view (e.g., Duffie 1996; Keane 2013), to manage inventory (e.g., Faulkner, 2008), to avoid a settlement/delivery failure (e.g., Musto, Nini, and Schwarz, 2018), or to hedge in an arbitrage strategy (e.g., Dive, Hodge, Jones, and Purchase, 2011). In the corporate bond market, borrows are less motivated by informed short-selling (Asquith, Au, Covert, and Pathak, 2013) and focus more on alternative considerations related to inventory control, market-making, and regulatory arbitrage (Foley-Fisher, Narajabad, and Verani, 2019).

corporate bonds to obtain cash collateral and that they reinvest cash collateral for yield enhancement.

Compared to what we know about short-sellers, our knowledge of and the related empirical evidence on bond lenders remain limited. Hence, to set the stage for our main analysis, we first conduct two diagnostic analyses to provide intuitions regarding the incentives for lenders to have a preference over bond maturity.

A. Lender Preference over Bond Maturity

We first sketch how lender preference is potentially related to corporate bond maturity. To achieve this goal, we highlight the intuition of Cohen, Diether, and Malloy (2007), who identify demand and supply shocks from stock-based short-selling by using paired information on prices (fees) and quantities (lending amount). Their idea is that an increase in lending amount together with an increase in lending fees signals a positive demand shock, whereby borrowers want to borrow more stocks for short-selling. In contrast, a simultaneous increase (decrease) in the lending amount (fees) implies a positive supply shock, whereby lenders are willing to lend out more stocks at a lower price.

We apply this intuition to understand lender preference in the cross section of corporate bonds. Consider the case in which compared to bond B, bond A is associated with a higher supply of lendable shares and lower fees. Other things being equal, bond A is associated with a higher lending incentive (i.e., a higher *lender preference*) because investors are willing to lend out more shares of A at a lower price. Following this intuition, we can infer lenders' potential preference over bond maturity by analyzing the cross-sectional distribution of bond maturity associated with lendable shares and fees.

We therefore sort corporate bonds in the lending market into five quintiles according to their lendable amounts (scaled by bond outstanding) or their lending fees, and we report the associated distribution of bond maturity in Table 3. We find that the bonds with the highest lendable amount (in Panel A) and the lowest lending fees (in Panel B) tend to have a median remaining time to maturity of approximately seven years, specifically 7.96 and 6.59 years, respectively. In addition, maturity monotonically increases in the lendable amount (Panel A) and decreases in lending fees (Panel B). These patterns suggest that bond lenders are willing

to lend out bonds with longer maturity at a lower price.¹¹ In other words, lenders, on average, have a preference for lending out long-term bonds.

To further control the potential influence of bond characteristics, we expand the above univariate illustration to a more formal multivariate analysis of how lending supply varies across bonds. More explicitly, Panel C reports the determinants of bond lending activities related to the fraction of lendable shares, the fraction of lent shares (i.e., bonds on loan), and lending fees. Several interesting observations emerge. First, lending activities are indeed strongly influenced by bond characteristics. Hence, it is important to control for bond characteristics in understanding the cross-section of lending market. Indeed, the positive (negative) relationship between their holdings and lendable/lent shares (lending fees) suggests that these institutional investors may actively supply lendable shares and, at the same time, be willing to accept lower lending fees. Our later tests will further exploit this property. Finally, bond maturity is positively related to lendable/lent shares and negatively related to lending fees even after controlling for all other bond characteristics. Hence, our multivariate analysis supports the previous univariate observation that lenders are willing to lend out bonds with longer maturity at a lower price.

The observation that lenders have differential preferences over bond maturities is heuristic. On the one hand, it confirms the importance of maturity in securities lending and collateral management. On the other hand, it provides a benchmark to sharpen the empirical design of our test. Recall that our main goal is to examine how fluctuations in lender preference influence firm behavior. Since lenders prefer bonds with a remaining maturity of seven years or longer, our task becomes whether variations in this preference could subsequently influence firm behavior in issuing bonds with a similar maturity.

B. Yield-enhancement Incentives of the Dual Investor-lender

As exhibited in the case of AIG and noted by Foley-Fisher, Narajabad, and Verani (2019), insurance companies often lend corporate bonds for yield-enhancement purposes in collateral management. The practitioner view (JP Morgan, 2006) further suggests that such an incentive and practice is widespread among other types of bond investors. If collateral management does

¹¹ Table 1 reports that consistent with these patterns, bonds with negative lending fees have an even longer maturity.

indeed allow bond investors to enhance yield, we should expect a direct link between the yieldenhancement incentive of bond investors and their willingness to participate in the lending market as lenders. Our second diagnostic analysis aims to explore this potential link for insurance companies and mutual funds, the two most important types of dual lender-investors of corporate bonds.

To achieve this goal, we leverage the intuition that holding bonds with RFY properties reflects the yield-enhancement incentive of financial intermediaries (e.g., Becker and Ivashina, 2015; Choi and Kronlund, 2017). Accordingly, we examine whether bond investors with higher RFY holdings participate in the bond lending market more actively. Empirically, following Choi and Kronlund (2017), we first define the bond-level RFY as the deviation of each bond's yield from the average yield of bonds in the same credit rating category. At the end of each holding quarter, we then calculate the investor-level RFY as the holding-weighted bond-level RFY across all bond holdings by each investor. Our investor sample includes insurance companies and mutual funds, which are known in the literature to have RFY incentives. We identify a bond investor as a high-RFY investor if its holding-weighted RFY is in the top quintile. For any particular bond, we can then use its ownership by high-RFY investors to proxy for the bond-level yield-enhancement incentive of investors.

Next, we use the lendable amount of a bond (scaled by its outstanding amount and calculated as the average of daily values within a quarter) as the main proxy for the willingness of lender-investors to participate in the bond lending market. We also supplement this measure with two additional variables: lending amount, which is scaled by its outstanding amount and calculated as the average of daily values within a quarter, and the average monthly number of lending transactions within a quarter. These additional variables are likely to be influenced by both lenders and borrowers and thus to be noisy in describing lenders' willingness to participate in the bond lending market. Nonetheless, they help us understand the general activeness of a bond in the lending market.

Based on these proxies, we conduct a bond-level analysis at quarterly frequency in which we link the participation willingness of bond investors to their lagged yield-enhancement incentives. We control for bond characteristics (*SIZE, LEV, B/M, ROA, TAN, DISP,* and *RATING* as well as equity lendable and bond trading liquidity) and include firm and year fixed effects, and we cluster the standard errors at the firm and year level. The results are reported in Table 4.

Panel A confirms a positive bond-level relationship between the yield-enhancement incentive of bond investors and their willingness to participate in the lending market as lenders. In particular, a one standard deviation increase in a bond's holdings by high-RFY investors is related to 4.80 bps increase in lendable shares in the next quarter. Compared to the average value of lendable (24 bps), this economic magnitude is sizable—it amounts to approximately 20% of the mean value. Likewise, realized lending activities are also increasing in ownership by high-RFY investors.¹²

Panel B presents the results at the firm level with a tilt in the long-term maturity niche. We aggregate bonds' holdings by high-RFY investors within a firm according to bond maturity and construct the variable *LT RFY_Holding* to proxy for the incentive to achieve yield enhancement via *long-term* bonds. We then examine whether this new variable can predict the willingness of bond investors to supply long-term bonds in the lending market. Panel B confirms a positive relationship. A one standard deviation higher level of long-term RFY ownership is related to a 0.10% higher future long-term lendable amount, which amounts to approximately 10% of the mean value.

These observations suggest that the yield-enhancement incentive of bond investors is positively related to their willingness to participate as lenders in the lending market. Note that as indicated by our first diagnostic test, long-maturity bonds are associated with lower lending fees (including negative fees). As a result, it is unlikely that high-RFY investors lend out these bonds just to receive low and even negative lending fees. Instead, these investors are more likely to lend out such bonds to benefit from collateral management.¹³

Collectively, the evidence in this section suggests that bond investors have a preference for lending out bonds with longer maturity due to the yield-enhancement goal of collateral management. As a result, changes in the benefits of collateral management may introduce

¹² A one standard deviation increase in a bond's holdings by high-RFY investors is related to a 0.68 bp increase in the lending amount (for reference, the average lending share is 2.12 bps) and a 29.50 increase in the number of lending transactions. Both of these effects are statistically and economically significant.

¹³ Investors can also use the repo market to obtain short-term financing from high-rated corporate bonds. However, for collateral management purposes, the securities lending market is more convenient both for the longer durations of the lending contracts and the amount of cash collateral that can be received. Lenders can receive cash collateral that amounts to 102% of the value of the securities on loan (Duffie, Gârleanu, and Pedersen, 2002). In contrast, the repo market typically offers short-term financing below the value of securities (e.g., 95% for AAA corporate bonds with 5-10 years of maturity as of July 1, 2019, according to the Federal Reserve Discount Window Margins and Collateral Guidelines).

variations in lenders' maturity preference. Armed with these results, we can now move on to investigate how such variations in lender preference affect corporate financing policies.

III. Baseline Analysis of Lender Preference and Corporate Financing Policies

In this section, we first examine the extent to which variations in lender preference may affect the corporate decision on the maturity niche of bond issuance. We then explore whether this effect is achieved through the channel of enhanced bond prices.

A. Lender Preference and Bond Issuance

Following Greenwood, Hanson, and Stein (2010), we regress *long-term bond issuance* on lender preference and a set of control variables. As discussed in Section II, we consider two proxies for lender preference: the firm-level lender preference, measured by *long-term bond lendable-Firm*, and the aggregate market-level lender preference, measured by *long-term bond lendable-Mkt*. The control variables include (i) market-level variables such as *long-term bond outstanding* and *long-term bond outstanding-Mkt*; (ii) firm-level variables such as *long-term bond outstanding-Firm* and *equity lendable*; (iii) bond trading liquidity, measured by *long-term bond liquidity*; and (iv) firm characteristics such as *SIZE, LEV, B/M, ROA, TAN, DISP* and *RATING*. We test the predictive power of lender preference for a firm's bond issuance decision in the following year. Thus, the independent variables take the end-of-year value and lag the dependent variable by one year.

Table 5 reports the results with Columns (1)-(3) presenting the OLS regression results and Columns (4)-(6) presenting the logit regression results. We first test the firm-level lender preference in Column (1), controlling for firm-level characteristics and also including the firm fixed effect and the rating-by-year fixed effect to absorb differences in firm characteristics, in particular, firm credit qualities that potentially influence the decision of bond issuance. Then we remove the two-way fixed effect and jointly test the firm-level and the market-level lender preference in Column (2). Note that the rating-by-year fixed effect can absorb any market-level variations thus is not suitable in this specification. In Column (3) we also drop the rating-by-year fixed effect but add *RATING* back to the control variables as a robust check. In all regression specifications, standard errors are clustered at the firm level.

Across all OLS regression specifications, we consistently find a strong positive relationship between the dummy variable of long-term bond issuance and the firm-level lender preference. The effect is also economically relevant: a one standard deviation increase in *long-term bond lendable-Firm* elevates the probability to issue long-term bonds in the next year by 3.44%~5.12%. Given that the average odds of long-term bond issuance per year is approximately 14.3%, the firm-level lender preference plays a noticeable role in driving the future bond issuance decision.

In contrast, the relationship between the long-term bond issuance dummy and the aggregate market-level lender preference is not significant as shown in Columns (2) and (3). This is probably because that lender preference at the market level varies mostly in the time series (as opposed to in the cross section). In other words, a better identified variation in lender preference has an impact in the cross section.

Among the control variables, we observe that *long-term bond outstanding-Firm* has negative predictive power for long-term bond issuance in the next year. Hence, the more a firm fills this specific maturity niche, the less incentive it has to issue similar bonds again. Also, we observe that firms with higher leverage and larger book-to-market ratios tend not to issue long-term bond in the next year; firms with higher credit risk also tend not to issue long-term bonds in the future. With the inclusion of the firm fixed effect, none of the other control variables exhibits a highly significant influence across all specifications.

Using the OLS linear models has a particular merit when the dependent variable is binary, that is, we do not need to rely on the numerical convergence of the estimation, which tends to be problematic with multidimensional fixed effects (Beck, 2018). However, for robustness, we also estimate the conditional logit model with the same specifications in Columns (4)-(6). The comparison of the logit models and the linear models would allow us to check whether serious bias arises in estimating the coefficients via linear models. Indeed, the estimations using the conditional logit models are consistent with the linear model estimations. The estimated coefficients for firm-level lender preference are significant in all the three specifications.

B. Lender Preference and Bond Pricing

We now explore bond pricing as a potential mechanism to guide firm policies. If dual lenderinvestors of bonds condition their purchases in the bond market on their lending preference, the high willingness to lend out certain types of bonds should spill over to the cash bond market in the form of a purchasing demand that drives up bond prices and drives down the expected bond return. This impact, if it exists, can help explain why companies have incentives to issue similar bonds—they can benefit from the lower cost of capital as implied by the higher bond price and lower expected return. In this section, we investigate this mechanism by linking lender preference to bond yield spreads and bond returns.

We first measure bond price changes by the value-weighted one-month-ahead yield spreads. More specifically, the monthly firm-level yield spread of long-term bonds is constructed as the average monthly yield spread across long-term bonds for a particular firm in month *t*, weighted by the outstanding amount of each bond. The bond-level monthly yield spread is the average of its daily values calculated from bond transaction prices netting out the corresponding yield of Treasury bonds with the same duration. We then regress the yield spreads of long-term bonds on lender preference and a set of control variables. All explanatory variables take the end-of-month value and are one-month lagged from the dependent variable. Accounting variables are based on their end-of-previous-year values.

Table 6 reports the results. We observe a strong and statistically significant negative relationship between long-term bond yield spreads and both proxies of lender preference. In Columns (1) and (2), when the two proxies are separately considered, a one standard deviation increase in *long-term bond lendable-Firm (long-term bond lendable-Mkt)* reduces future long-term bond yield spreads by 0.32% (0.74%). When the two proxies are jointly considered in Column (3), the corresponding impact becomes 0.19% (0.65%). Given that the average bond yield spread is approximately 2.50%, the impact of bond lender preference on future bond yield spreads is economically significant. Hence, lender preference can significantly enhance future bond prices.

Among the control variables, the corporate proxy for gap filling, *long-term bond outstanding-Mkt*, exhibits a significant impact on yield spread. More importantly, equity short-selling also has a significant impact. However, its direction is the opposite of that of bond lending: equity short-selling is positively related to future yield spread and thus negatively predicts bond price. This observed difference confirms the economic disparity between bond lending and equity lending. Equity short-selling is motivated by information (as it predicts price drops), whereas bond lending effectively spills over to the cash bond market and drives demand

(pushing up the bond price).¹⁴

We then consider an alternative measure of bond pricing, expected corporate bond return, which is particularly useful in measuring the financing costs of firms (Gebhardt, Hvidkjaer, and Swaminathan, 2005). For any particular firm, we measure the expected return of its long-term bonds as the one-month-ahead value-weighted returns of its long-term bonds. We then regress this variable on lender preference and a set of control variables. We report the new results in Table 7.

The baseline message is similar to what we derive from Table 6. Specifically, we find a strong negative relationship between expected returns of long-term bonds and the two proxies of lender preference for these bonds. In the firm-level panel regression (Column (1)), a one standard deviation increase in *long-term bond lendable-Firm* leads to 0.41% lower expected bond returns, which is more than half of the average monthly bond returns (0.73%, as shown in Table 2).

Jointly, these results confirm that lender preference can influence firm policies via bond prices. In this mechanism, a positive change in lender preference transforms into a lower cost of debt for firms, which in turn motivates them to issue more bonds in the related maturity niche. Importantly, the influence of bond lending on bond prices is the opposite of that of equity lending, confirming that the mechanism that we propose differs from the known channel of informed short-selling through which the equity lending market can affect firm policies.

IV. The 2010 NAIC Regulation and Related Endogeneity Tests

Thus far, our results suggest that the lending incentives of bond lender-investors may affect the financing policies of firms. Although we show that this mechanism differs from the informed short-selling channel, there could be remaining concerns that some omitted variables may affect both lender preference and firm policies. To alleviate this concern, we exploit a regulatory shock that exogenously affected—and affected only—the willingness of insurance companies to participate in the bond lending market.

¹⁴ The firm characteristics such as leverage, book-to-market ratio, return on assets, tangible assets, and the dispersion of analyst opinions have the expected signs in their influence on bond yield spreads: firms with higher leverage, larger book-to-market ratio, lower return on assets, higher tangible assets, and less transparency (more dispersion of analyst opinions) tend to have a higher cost of capital.

A. Impact of the NAIC Regulation on Securities Lending

In the bond market, one reason for the popularity of collateral management is that financial intermediaries can reinvest cash collateral in other securities as *off-balance-sheet* transactions. Since disclosure requests and regulations on off-balance-sheet transactions and assets are less demanding than those on on-balance-sheet ones, many financial intermediaries employ collateral management as a tool to relax their regulatory constraints. The reinvesting of cash collateral in toxic securities by AIG during the subprime crisis offers an extreme example of this practice.

In 2010, however, the National Association of Insurance Commissioners (NAIC) required insurance companies to disclose their engagement in the securities lending market as a remedy for this regulatory loophole. According to the new regulation, insurance companies need to report information on both their securities lending and reinvestment of the lending proceeds. The impact of the regulation has been severe, effectively reducing the participation of insurance companies in the securities lending market. According to a NAIC report, the amount of lending by insurance companies decreased significantly from 2008 to 2011.¹⁵ The reduced participation may have been due to the reduced usefulness of collateral management for relaxing regulatory constraints, to the increased costs associated with additional disclosure (e.g., Goldstein and Yang 2019), or to the reputation risk posed by being publicly associated with borrowers blamed for depressing security prices. Regardless of the underlying reasons, the regulation introduced an exogenous disruption in the participation of insurance companies in securities lending—and hence their related lender preference. Below, we examine how this exogenous change in lender preference affected firm policies.

B. Instrumental Variable Regression

To exploit this regulatory shock, we first create a regulation dummy that takes the value of one from 2010, when the regulation began to require insurance companies to release their lending information, and zero before 2010. We then measure the impact of the policy on lender preference by interacting firm-level long-term bond holding by insurance companies (scaled by these bonds' outstanding amount) and the regulation dummy. Although the pre-regulation holding variable is endogenous, its interaction with the regulation dummy, which takes the

¹⁵ See, e.g., the July 8, 2011, NAIC report at <u>http://www.naic.org/capital_markets_archive/110708.htm</u>.

value of one for the post-regulation period, provides a reasonable instrument to capture the exogenous shock introduced by the regulation that negatively affected the supply of lendable shares in the post-policy period.¹⁶

Accordingly, we conduct the following two-stage IV analysis. In the first stage, we examine whether the interaction term affects the firm-level lender preference proxy. In the second stage, we revisit the relationship between instrumented lender preference and bond issuance as well as bond prices. We adopt the specification as reported in Column (1) of Tables 5, 6, and 7 to examine the second-stage relationship.

Table 8 presents the results. In the first stage, we observe a negative relationship between the interacted instrument and the firm-level lender preference proxy, *long-term bond lendable-Firm*. This observation confirms the negative impact of the regulation on the bond lendable supply. In the second stage, we find that the instrumented lender preference has significant predictive power for future bond issuance and bond prices. A one standard deviation increase in the instrumented lender preference increases the probability of bond issuance in the same maturity niche in the next year by 1.83%. It also reduces the next-month yield spreads and the expected bond return of long-term bonds by 0.43% and 0.26%, respectively.

To further explore the power and the economic interpretation of the above results, we also conduct a placebo test by applying the same instrumental approach to the financial crisis. More explicitly, we treat 2008, the peak year of the financial crisis, as a pseudo-event to interact with the (pre-crisis) long-term bond holdings by insurance companies. We find that both this interaction in the first stage and the influence of instrumented lender preference on bond prices in the second stage become largely insignificant. Economically speaking, these results suggest that the financial crisis does not disincentivize insurance companies in supplying lendable bonds from their holdings.¹⁷ As a result, its economic role and potential influence also differ from the NAIC regulation or the mechanism examined in our current analysis. In the interest of space, we do not tabulate these insignificant coefficients. Above all, the placebo test suggests

¹⁶ For instance, if the regulation completely wiped out the incentives for insurance firms to participate in the lending market, then high preregulation bond holding should translate into a high reduction in lendable shares. In this case, a high reduction in lendable shares would arise exogenously because a larger portion of the bonds (i.e., the holdings of insurance companies) was frozen in the lending market following the regulation. The same intuition holds for the case in which the regulation froze only a fraction of insurance companies' bond holdings in the lending market.

¹⁷ This observation is reasonable because lendable shares actually increase during the crisis period, as revealed in our summary statistics.

that our IV test has the proper power to reject economic resources unrelated to the disruption of insurance companies' incentives in participating in securities lending.

V. Additional Tests

We finally conduct four additional tests to strengthen our results. We first examine the heuristic cases in which lending fees become negative. Since lending fees reflect the *net* benefit of lending (including the compound influence of rebate rates and direct borrowing costs), negative lending fees mean that lenders essentially pay borrowers a funding cost in exchange for cash collateral. During the financial crisis of 2007-2008, insurance companies such as AIG relied heavily on the bond lending market to obtain funding, and many such lending transactions had negative lending fees.

Table 9 repeats the same analysis as that in Tables 5, 6, and 7, assessing the impact of corporate bond lender preference on bond issuance, bond yield spreads, and bond returns in the scenario of negative lending fees. We define the variable *NegFee Ratio* as the ratio of the number of bonds with negative fees to the total number of bonds issued by firm *i* at time *t*. The higher the ratio is, the more lending transactions are conducted with negative lending fees, hence reflecting a higher lender preference for long-term bonds. Our main variable of interest is the interaction of lender preference and this ratio.

We find that for firms with a higher percentage of transactions with negative lending fees, the predictive power of lender preference for each of the test variables (bond issuance, bond yield spreads, and bond returns) significantly strengthens. In particular, a one standard deviation increase in the lender preference for these firms elevates the probability of long-term bond issuance in the next year by an additional 1.20%, cuts future long-term bond yield spreads by an additional 0.23%, and reduces expected bond returns by an additional 0.31%.

Second, we evaluate whether our results hold for the subsample of nonfinancial firms. All our main results apply to the universe of U.S. public firms. Since most corporate finance studies focus on nonfinancial firms, we repeat our analysis and report the subsample results in Table 10. The panel regression results are quantitatively and qualitatively similar to the previously reported results for all types of firms, as shown in Tables 5, 6, and 7. Hence, the relationship between bond lending and corporate debt policies can go beyond the financial industry to influence any type of firms in the real economy.

Third, we consider alternative proxies of lender preference which substitute lendable

amount in the original proxies with the lending amount. The lending amount is an equilibrium result from both lender preference and borrower preference, whereas the lendable amount is more reflective of the willingness of lenders to lend a specific bond. We find that the alternative measure of the aggregate market-level lender preference exerts a significant influence on bond issuance and bond prices, as shown in Table 11. Hence, our main results are robust to the use of the alternative proxy. The alternative measure of firm-level lender preference can also predict future bond issuance and future bond returns. However, it has no predictive power for future bond yield spreads.

Lastly, we investigate whether our collateral story in the bond lending market is spuriously related to intrinsic bond characteristics such as covenants. We construct the dependent variable as the difference in corporate bond yield spreads for long-term bonds with and without covenants issued by firm *i* in month *t*. We then regress the difference in yield spreads on our proxies of lender preference and the set of control variables defined before. The results in Table 12 show that lender preference has no significant explanatory power for the difference in yield spreads, regardless of whether a bond has covenants. This result further alleviates concerns over a spurious correlation.

Conclusion

In this paper, we propose and test a novel mechanism through which the bond lending market exerts real impacts on corporate financing policies. Under this mechanism, dual lenderinvestors of bonds condition their purchases in the bond market on their lending preference. As a result, an increased lender preference for certain types of bonds increases bond prices, which incentivizes firms to issue more similar bonds to benefit from a lower cost of capital.

We test this mechanism by exploring the bond maturity niche. Consistent with our working hypotheses, we find that an increase in lender preference for long-term bonds is associated with higher chance of issuing long-term bonds in the following year as well as lower future yield spreads and lower expected returns of long-term bonds. To alleviate the endogeneity concern, we further exploit a regulatory shock introduced by the NAIC in 2010 and our analysis using an instrumental variable specification lends support to a causal interpretation of our main findings.

Our findings suggest that stock short-selling and bond lending may play fundamentally different roles in our economy, which reflects the disparity in the skills of borrowers and a

divergence of the incentives and practices of lenders in the two markets. While many of the known impacts of the stock lending market operate through the common channel of informed short-selling, the new mechanism explored in our paper highlights a different economic basis whereby securities lending can influence the real economy. Our results call for more research to understand the role of lenders in the securities lending market.

References

Aggarwal, R., J. Bai, and L. Laeven, 2020, Safe Asset Shortages: Evidence from European Government Bond Lending Market. *Journal of Financial and Quantitative Analysis*, forthcoming.

Aggarwal, R., Saffi, P., and J. Sturgess, 2015, The role of institutional investors in voting: Evidence from the securities lending market, *Journal of Finance* 705. 2309–2346.

Amihud, Yakov, 2002, Illiquidity and Stock Returns: Cross-Section and Time Series Effects. *Journal of Financial Markets* 5, 31-56.

Amihud, Yakov, and Haim Mendelson, 2012, Liquidity, the Value of the Firm, and Corporate Finance. *Journal of Applied Corporate Finance* 24, 17-32.

Anderson, M., B.J., Henderson, N.D, Pearson, 2018, Bond lending and bond returns, Working Paper.

Asquith, P., Au, A. S., Covert, T., and P.A. Pathak, 2013, The market for borrowing corporate bonds, *Journal of Financial Economics* 1071, 155–182.

Badoer, D. C., and C. M. James, 2016, The Determinants of Long-Term Corporate Debt Issuances. *Journal of Finance*, 71, 452-492.

Bai, J., T. Bali, and Q. Wen, 2019, Common Risk Factors in the Cross-Section of Corporate Bond Returns. *Journal of Financial Economics*, 131, 619-642.

Bai, J., 2018, What Bond Lending Reveals? The Role of Informed Demand in Predicting Credit Spread Changes. Working paper, Georgetown University.

Bai, J., P. Collin-Dufresne, R. Goldstein, and J. Helwege, 2015. On Bounding Credit Event Risk Premia,

Review of Financial Studies, 28, 2608-2642.

Bai, J., and L. Wu, 2016. Anchoring Corporate Credit Spreads to Firm Fundamentals, *Journal of Financial & Quantitative Analysis*, 51, 1521-1543.

Barclay, Michael J., and Clifford W. Smith, 1995. The Maturity Structure of Corporate Debt. *Journal of Finance* 50, 609-631.

Ben-Rephael, A., J. Choi, and I. Goldstein, 2020, Mutual Fund Flows and Fluctuations in Credit and Business Cycles, *Journal of Financial Economics*, forthcoming.

27

Bo, Becker, and Victoria Ivashina, 2015. Reaching for Yield in the Bond Market. *Journal of Finance* 70, 1863-1902.

Bessembinder, H., and W. Maxwell. 2009. Transparency and the corporate bond market. *Journal of Economic Perspectives* 22, 217-234.

Bessembinder, H., W. Maxwell, and K. Venkataraman. 2006. Market transparency, liquidity externalities, and institutional trading costs in corporate bonds. *Journal of Financial Economics* 82, 251-288.

Brunnermeier, Markus, and Lasse H. Pedersen, 2009. Market Liquidity and Funding Liquidity. *Review of Financial Studies* 22, 2201-2238.

Cantillo, Miguel, and Julian Wright, 2000. How Do Firms Choose Their Lenders? An Empirical Investigation. *Review of Financial Studies* 13, 155-189.

Choi, J., D. Hackbarth and J. Zechner, 2018. Corporate Debt Maturity Profiles. *Journal of Financial Economics* 130, 484-502.

Choi, J., Hoseinzade, S., Shin, S. S., Tehranian, H., 2019. Corporate bond mutual funds and asset fire sales. *Journal of Finance Economics*.

Choi, Jaewon, and Mathias Kronlund, 2017. Reaching for Yield in Corporate Bond Mutual Funds. *Review of Financial Studies 31*, 1930-1965.

Cohen, Lauren, Karl Diether, and Christopher J. Malloy, 2007. Supply and Demand Shifts in the Shorting Market, *Journal of Finance* 62, 2061-2096.

Collin-Dufresne, Pierre, Robert Goldstein, and James Spencer Martin, 2001. The Determinants of Credit Spreads. *Journal of Finance* 56, 2177–2207.

Custodio, Claudia, Miguel A. Ferreira, and Luis Laureano, 2013. Why are U.S. firms using more short-term debt? *Journal of Financial Economics* 108, 182–212.

Dass, Nishant, and Massimo Massa. 2014. The variety of maturities offered by firms and institutional investment in corporate bonds. *Review of Financial Studies* 27, 2219-2266.

Denis, David J., and Vassil 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, Douglas W., 1984. Financial Intermediation and Delegated Monitoring. *Review of Economic Studies* 51, 393–414.

Diamond, Douglas W., 1991. Monitoring and Reputation: The Choice Between Bank Loans and Directly Placed Debt. *Journal of Political Economy* 99, 689–721.

Dive, Matthew, Ronan Hodge, Catrin Jones, and James Purchase, 2011. Developments in the global securities lending market. *Bank of England Quarterly Bulletin*.

Drechsler, I., and Freda Drechsler, 2016. The Shorting Premium and Asset Pricing Anomalies. Working paper, New York University.

Duffie, Darrell, 1996. Special repo rates. Journal of Finance 51, 493–526.

Duffie, Darrell, Nicholas Gârleanu, and Lasse H. Pedersen, 2002. Securities lending, shorting, and pricing, *Journal of Financial Economics* 662, 307–339.

Fang, Vivian, Allen Huang, and Jonathan Karpoff, 2016. Short Selling and Earnings Management: A Controlled Experiment, *Journal of Finance*, 71, 1251-1294.

Fang, Vivian, Xuan Tian, and Sheri Tice, 2014. Does Stock Liquidity Enhance or Impede Firm Innovation? *Journal of Finance* 69, 2085–2125.

Faulkner, Mark C., 2008. An Introduction to Securities Lending. *Handbook of Finance: Financial Markets and Instruments*.

Foley-Fisher. N., B. Narajabad, and S. Verani, 2019. Securities Lending: Wholesale Funding and the Supply of Safe Assets. Working paper, the Board of the Federal Reserve System.

Fostel, Ana, and John Geanakoplos, 2014. Endogenous Collateral Constrains and the Leverage Cycle. *Annual Review of Economics* 6, 771-799.

Gan, Jie, 2007. The Real Effects of Asset Market Bubbles: Loan- and Firm-Level Evidence of a Lending Channel. *Review of Financial Studies* 20, 1941-1973.

Gebhardt, William R., Soeren Hvidkjaer, and Bhaskaran Swaminathan, 2005. Stock and bond market interaction: Does momentum spill over? *Journal of Financial Economics* 75, 651-690.

Goldstein, Itay, and Liyan Yang, Good Disclosure, 2019. Bad Disclosure, *Journal of Financial Economics*, 131(1): 118–138.

Greenwood, Robert, Samuel Hanson, and Jeremy C. Stein, 2010. A Gap-Filling Theory of Corporate Debt Maturity Choice. *Journal of Finance* 65, 993–1028.

Greenwood, Robert, and Dimitry Vayanos, 2008. Bond Supply and Excess Bond Returns. NBER Working Paper No. 13806.

Grullon, Gustavo, Sébastien Michenaud, and James P. Weston, 2015. The Real Effects of Short-Selling Constraints. *Review of Financial Studies* 28, 1737-1767.

Guedes, Jose, and Tim Opler, 1996. The Determinants of the Maturity of Corporate Debt Issues. *Journal of Finance* 51, 1809-1833.

Houston, Joel, and Christopher James, 1996. Bank Information Monopolies and the Mix of Private and Public Debt Claims. *Journal of Finance* 51, 1863-1889.

Jiao, Yawen, Massimo Massa, and Hong Zhang, 2016. Short Selling Meets Hedge Fund 13F: An Anatomy of Informed Demand. *Journal of Financial Economics* 122, 544-567.

JP Morgan Sponsored Statement, by Jim Wilson, 2006. "Securities Lending: An Asset/Liability Business."

Keane, Frank M. 2013. Securities loans collateralized by cash: Reinvestment risk, run risk, and incentive issues, *Current Issues in Economics and Finance* 19(3).

Kiyotaki, N., and J. Moore, 1997, Credit cycles, Journal of Political Economy, 105, 211-248.

Leary, M. T., 2009. Bank loan supply, lender choice, and corporate capital structure. *Journal of Finance* 63, 2013-2059.

Lemmon, Michael, and Michael R. Roberts, 2010. The Response of Corporate Financing and Investment to Changes in the Supply of Credit. *Journal of Financial and Quantitative Analysis* 45, 555-587.

Lin, H., J.Wang, and C. Wu, 2011. Liquidity risk and expected corporate bond returns. *Journal of Financial Economics* 99, 628-650.

Ljungqvist, Alexander, and Wenlan Qian, 2016. How constraining are limits to arbitrage? *Review of Financial Studies* 29, 1975-2028.

Massa, Massimo, Bohui Zhang, and Hong Zhang, 2015. The Invisible Hand of Short Selling: Does Short-Selling Discipline Earnings Management? *Review of Financial Studies* 28, 1701-1736.

McDonald, R. L. and A. Paulson. 2015. AIG in Hindsight. *Journal of Economic Perspectives* 29, 81-106.

Mian, Atif, 2008. Tracing the impact of bank liquidity shocks: Evidence from emerging market. *American Economic Review* 98, 1413–42.

Musto, David, Greg Nini, and Krista Schwarz, 2018. Notes on Bonds: Illiquidity Feedback During the Financial Crisis. *Review of Financial Studies* 31, 2983-3018.

Peirce, Hester, 2014. Securities Lending and the Untold Story in the Collapse of AIG, George Mason University Mercatus Center Working Paper No. 14-12.

Rajan, Raghuram G., 1992. Insiders and outsiders: the choice between informed and arm's length debt. *Journal of Finance* 47, 1367-1399.

Roberts, Michael R., and Amir Sufi, 2009, Renegotiation of financial contracts: Evidence from private credit agreements, *Journal of Financial Economics* 93, 159–184.

Saffi, Pedro A.C., and Kari Sigurdsson, 2011. Price Efficiency and Short Selling. *Review of Financial Studies* 24, 821–852.

Schaefer, Stephen, 1982, Tax-Induced Clientele Effects in the Market for British Government Securities: Placing Bounds on Security Values in an Incomplete Market, *Journal of Financial Economics* 10, 121-159.

Sufi, Amir, 2009. The real effects of debt certification: Evidence from the introduction of bank loan ratings. *Review of Financial Studies* 22, 1659-1691.

Zhu, Qifei, 2020, Capital Supply and Corporate Bond Issuances: Evidence from Mutual Fund Flows. *Journal of Financial Economics*, forthcoming.

Table 1: Bond Characteristics in the Lending Market and the Primary Market

The table presents the number of bonds, the number of firms, and the mean, median, and standard deviation of bond size (in billion dollars), remaining years to maturity, and credit rating. Rating takes numerical values, with AAA=1, AA+=2,... C=21. Investment-grade bonds have ratings from 1 to 10, and speculative-grade bonds have ratings from 11 to 21. The rating is based on Standard & Poor's long-term firm rating. We report the information for corporate bond lending market and corporate bond primary and secondary markets. In the primary market, maturity refers to the number of years between the maturity date and the issue date. The sample period is from January 2005 to December 2014.

| | | | | Size (\$bil) | | М | Maturity (year) | | | Rating | |
|---------------------------|-------|-------|------|--------------|------|-------|-----------------|-------|------|--------|------|
| | Bonds | Firms | Mean | Median | SD | Mean | Median | SD | Mean | Median | SD |
| Bond lending market | 26487 | 4509 | 0.47 | 0.30 | 0.53 | 8.96 | 5.75 | 10.35 | 8.78 | 8.00 | 4.09 |
| Lending with negative fee | 11774 | 2813 | 0.64 | 0.40 | 0.66 | 10.02 | 5.99 | 10.92 | 7.17 | 7.00 | 3.04 |
| Lending with positive fee | 26482 | 4508 | 0.45 | 0.30 | 0.51 | 8.87 | 5.73 | 10.30 | 8.91 | 8.00 | 4.13 |
| Lendable but not on loan | 25456 | 4509 | 0.24 | 0.16 | 0.31 | 8.73 | 5.20 | 11.07 | 8.38 | 8.00 | 4.18 |
| Bond secondary market | 43542 | 4596 | 0.53 | 0.35 | 0.63 | 8.71 | 5.88 | 8.86 | 8.63 | 8.00 | 4.32 |
| Bond primary market | 33918 | 3244 | 0.30 | 0.10 | 0.51 | 8.41 | 7.00 | 7.87 | 7.27 | 6.00 | 4.41 |

Table 2: Summary Statistics of Main Variables

LT bond issuance is a dummy variable that equals to 1 if firm i issues one or more long-term bonds in a given year. A bond is identified as the long-term bond if it has more than seven years remaining to maturity. LT yield spread is the value-weighted end-of-month yield spread across all long-term bonds of firm i, where the bond-level yield spread is the difference of a bond's yield-to-maturity and the duration-matched Treasury bond yield. LT bond return is the value-weighted monthly return across all long-term bonds of firm i. LT bond lendable-Firm is the total lendable amount of long-term bonds scaled by the total outstanding amount of long-term bonds by firm i at the end of each month. LT bond lendable-Mkt is the total lendable amount of long-term bonds across all firms in the sample scaled by these bonds' outstanding amount at the end of each month. LT bond outstanding-Firm is the total outstanding amount of long-term bonds by firm i scaled by the total outstanding amount of all bonds by the same firm at the end of each month. LT bond outstanding-Mkt is the total outstanding amount of long-term bonds across all firms in the sample scaled by the total outstanding amount of all bonds by those firms at the end of each month. LT Treasury outstanding is the total outstanding amount of long-term Treasury bonds scaled by the total outstanding amount of all Treasury bonds at the end of each month. LT bond liquidity is the value-weighted liquidity of long-term bonds by firm i scaled by the value-weighted liquidity of all bonds by the same firm at the end of each month, where bond liquidity takes the Amihud (2002) measure. Equity lendable is the total lendable amount of equities by firm i scaled by their market capitalization at the end of each month. DISP is the standard deviation of one-year ahead forecast on firm i's earnings across analysts reported in I/B/E/S dataset. RATING is the S&P long-term firm rating which takes numerical values with AAA=1.... C=21. SIZE is the logarithm of total assets (in million dollars). B/M is the ratio of book value to market value. LEV is the leverage ratio defined as the sum of short-term debt and long-term debt divided by these debt value plus the market value of equities. ROA is the return on asset in percentage, defined as the ratio of net income to total asset. TAN is the tangible ratio defined in the way of Almeida and Campello (2007). The sample contains all corporate bonds issued by the U.S. public firms excluding convertible bonds. The sample period is 2005-2014.

| Variable | Notation | | e Sample 5-Dec2014) | | ce Crisis 5-Nov2007) | | g Crisis 7-Jun2009) | | Crisis D-Dec2014) |
|----------------------------|--|-------|------------------------|-------|-------------------------|--------|------------------------|-------|----------------------|
| | | Mean | SD | Mean | SD | Mean | SD | Mean | SD |
| LT bond issuance | | 0.143 | 0.350 | 0.138 | 0.345 | 0.137 | 0.344 | 0.147 | 0.354 |
| LT yield spread (%) | $Yield_{i,L}$ | 2.500 | 4.480 | 1.542 | 3.722 | 5.007 | 7.878 | 2.358 | 3.211 |
| LT bond return (%) | $Ret_{i,L}$ | 0.734 | 4.521 | 0.432 | 3.308 | 0.512 | 8.898 | 0.938 | 3.468 |
| LT bond lendable-Firm | L_{iL}^{CB}/D_{iL}^{CB} | 0.207 | 0.140 | 0.185 | 0.161 | 0.252 | 0.160 | 0.208 | 0.118 |
| LT bond lendable-Mkt | $L_L^{\overline{CB}}/D_L^{\overline{CB}}$ | 0.187 | 0.052 | 0.151 | 0.077 | 0.223 | 0.030 | 0.197 | 0.017 |
| LT bond outstanding-Firm | $D_{iL}^{\overline{CB}}/D_i^{\overline{CB}}$ | 0.456 | 0.222 | 0.453 | 0.225 | 0.456 | 0.229 | 0.458 | 0.218 |
| LT bond outstanding-Mkt | $D_L^{\overline{CB}}/D^{CB}$ | 0.351 | 0.017 | 0.333 | 0.008 | 0.344 | 0.003 | 0.362 | 0.013 |
| LT Treasury outstanding | $D_L^{G'}/D^G$ | 0.153 | 0.034 | 0.196 | 0.007 | 0.177 | 0.010 | 0.125 | 0.012 |
| LT bond liquidity | LIQ_{iL}/LIQ | 1.172 | 0.584 | 1.145 | 0.615 | 1.213 | 0.579 | 1.174 | 0.573 |
| Equity lendable | L_i^{EQ}/D_i^{EQ} | 0.216 | 0.107 | 0.160 | 0.111 | 0.257 | 0.114 | 0.235 | 0.089 |
| Log of total asset | SIZE | 8.229 | 1.916 | 7.990 | 1.957 | 8.146 | 1.913 | 8.434 | 1.861 |
| Book-to-market ratio | B/M | 0.528 | 1.110 | 0.415 | 1.049 | 0.703 | 1.382 | 0.560 | 1.054 |
| Leverage | LEV | 0.436 | 0.333 | 0.405 | 0.339 | 0.507 | 0.337 | 0.438 | 0.323 |
| Return on assets (%) | ROA | 0.399 | 47.35 | 1.545 | 31.75 | -4.173 | 74.45 | 0.921 | 46.37 |
| Tangibility | TAN | 0.436 | 0.164 | 0.445 | 0.162 | 0.436 | 0.162 | 0.430 | 0.166 |
| Analyst opinion dispersion | DISP | 0.180 | 0.274 | 0.135 | 0.227 | 0.212 | 0.314 | 0.201 | 0.286 |
| SP LT firm rating | RATING | 10.58 | 3.696 | 10.31 | 3.776 | 10.73 | 3.863 | 10.71 | 3.585 |

Table 3: Lending Activities and Bond Characteristics

Panels A and B report the median value of bond characteristics for portfolios sorted by lendable amount and lending fee at the end of each month. Panel C shows the results of regressing lending activities on bond characteristics including time-to-maturity (in year), bond size (in billion dollars), rating, coupon rate, a dummy variable for bonds with put options or redeem option. We also consider the aggregate holdings of a specific bond by insurance companies (IC), mutual funds (MF), and other institutional investors such as pension funds. Lendable (lending) amount is defined as the bond-level lendable (lending) amount scaled by bond outstanding amount, expressed in percentage, and lending fee is defined as the transaction-weighted cost for borrowing one dollar of a particular bond based on all open transactions, expressed in basis points and annualized. In Panels A and B, bond trading illiquidity uses the Amihud (2002) measure. The sample period is 2005-2014.

| | Lendable | TTM (yr) | Size (\$bil) | Rating | Illiquidity |
|------|----------|----------|--------------|--------|-------------|
| Low | 2.16 | 4.06 | 0.250 | 9 | 8.82 |
| 2 | 12.47 | 4.63 | 0.300 | 8.5 | 2.86 |
| 3 | 20.43 | 5.71 | 0.350 | 8.5 | 3.09 |
| 4 | 28.61 | 6.75 | 0.350 | 8 | 4.06 |
| High | 43.91 | 7.96 | 0.250 | 8 | 5.32 |

Panel A: Bond portfolios sorted by lendable amount (%)

Panel B: Bond portfolios sorted by lending fee (bps)

| | Fee | TTM (yr) | Size (\$bil) | Rating | Illiquidity |
|------|-------|----------|--------------|--------|-------------|
| Low | 3.38 | 6.59 | 0.500 | 7.5 | 3.16 |
| 2 | 7.19 | 6.38 | 0.500 | 8 | 2.92 |
| 3 | 9.15 | 6.26 | 0.450 | 8.5 | 3.32 |
| 4 | 10.00 | 5.75 | 0.375 | 9 | 3.85 |
| High | 20.12 | 5.21 | 0.350 | 11 | 3.47 |

Panel C: Determinants of bond lending activities

| | L | endable (% | %) | I | Lending (% | () | | Fee (bps) | |
|-----------------|---------------|-------------------------|-------------------------|--------------|-------------------------|-------------------------|----------|---------------------------|---------------------------|
| TTM | 0.23*** | | 0.21*** | 0.04*** | | 0.04*** | -0.08*** | | -0.07*** |
| | (10.98) | | (11.12) | (9.54) | | (9.75) | (-3.57) | | (-3.70) |
| SIZE | 0.29 | | 1.15*** | -0.31*** | | -0.13*** | -2.70*** | | -2.94*** |
| | (0.90) | | (4.96) | (-4.77) | | (-2.60) | (-3.26) | | (-3.68) |
| RATING | -1.09*** | | -0.79*** | 0.04* | | 0.10*** | 4.30*** | | 3.951^{***} |
| | (-8.45) | | (-7.64) | (1.67) | | (4.32) | (8.77) | | (8.65) |
| COUPON | 1.71^{***} | | 1.22^{***} | 0.08^{***} | | -0.01 | -0.44*** | | -0.11 |
| | (20.61) | | (18.35) | (3.64) | | (-0.51) | (-3.13) | | (-0.81) |
| PRIVATE | -2.12^{***} | | -1.35*** | -0.28** | | -0.11 | -6.85*** | | -7.27*** |
| | (-5.56) | | (-4.57) | (-2.54) | | (-1.03) | (-4.71) | | (-4.88) |
| CALLABLE | 1.07^{**} | | 0.57 | -0.01 | | -0.12 | -2.09** | | -1.99** |
| | (2.21) | | (1.42) | (-0.11) | | (-0.92) | (-2.38) | | (-2.36) |
| $Holding^{IC}$ | | 0.27^{***} | 0.25^{***} | | 0.05^{***} | 0.05^{***} | | -0.17^{***} | -0.14*** |
| $Holding^{MF}$ | | (34.22) 0.18^{***} | (31.26) 0.17^{***} | | (17.18) 0.03^{***} | (17.08) 0.03^{***} | | (-12.69) -0.06^{***} | (-11.19) -0.07^{***} |
| monung | | (19.15) | (18.87) | | (11.41) | (11.53) | | (-2.83) | (-3.54) |
| $Holding^{OTH}$ | | (19.15) 0.22^{***} | (10.07) 0.18^{***} | | (11.41) 0.01^{**} | (11.55) 0.01^* | | -0.17*** | -0.09*** |
| - | | (13.49) | (11.12) | | (2.46) | (1.71) | | (-5.84) | (-3.47) |
| Firm FE | Υ | Y | Y | Υ | Y | Ý | Y | Y | Ý |
| Time FE | Υ | Υ | Υ | Υ | Υ | Υ | Υ | Υ | Υ |
| Cluster | Υ | Υ | Υ | Υ | Υ | Υ | Υ | Υ | Υ |
| Obs | 595971 | 575674 | 571315 | 595971 | 575674 | 571315 | 595971 | 575674 | 571315 |
| Adj. R^2 | 0.488 | 0.534 | 0.562 | 0.281 | 0.300 | 0.305 | 0.270 | 0.279 | 0.276 |

Table 4: Lending Activities of Bonds held by High Reaching-for-Yield Investors

The table examines the predictive relationship of bonds ownership by high reaching-for-yield (RFY) investors and these bonds' future activities in the lending market. We consider three dimensions of lending activities as the dependent variable: the lendable amount and the lending amount of bond-*i* scaled by its outstanding amount, both are calculated as the average of daily values within quarter-t, and the number of lending transactions which is calculated as the average monthly values within quarter-t and the monthly value is the total number of transactions in a particular month. Panel A shows the bond-level prediction regression results in the following setup:

$$LendingActivity_{i,j,t+1} = \alpha + \alpha_j + \alpha_t + \beta RFY_Holding_{i,j,t} + \varepsilon_{i,j,t+1},$$

where RFY_Holding_{i,j,t} is the bond-level aggregate holding amounts by its high-RFY investors scaled by a bond's outstanding amount at the end of quarter t. High-RFY investors refer to investors with a rank of 5 which is gauged in the following way. At the end of each quarter, corporate bond investors within insurance companies and mutual funds will be sorted into quintiles by the investor-level RFY, which is the holding-weighted average of bond-level RFY. Investors with the highest RFY holdings have a rank of 5, and those with the lowest RFY holdings have a rank of 1. The bond-level RFY measure is defined as the deviation of each bonds yield from the average yield of bonds in the same credit rating category, as in Choi and Kronlund (2017). Panel B presents the firm-level prediction regression with a tilt in maturity niche:

$$LT \ Activity_{j,t+1} = \alpha + \alpha_j + \alpha_t + \beta \ LT \ RFY_Holding_{j,t} + \varepsilon_{j,t+1},$$

That is,

$$\frac{Activity_{j,t+1}^{LT}}{Activity_{j,t+1}^{LT} + Activity_{j,t+1}^{ST}} = \alpha + \alpha_j + \alpha_t + \beta \frac{RFY_Holding_{j,t}^{LT}}{RFY_Holding_{j,t}^{LT} + RFY_Holding_{j,t}^{ST}} + \varepsilon_{j,t+1}$$

We first aggregate bonds holdings by high RFY investors within a firm according to bond maturity, long-term versus short-term, and then construct the variable *LTRFY_Holding* which is the holdings of long-term bonds by high RFY investors scaled by the total holdings of all bonds of the same firm by the same investors. Control variables are defined in Table 2. Standard errors are calculated by clustering at the firm and year level. The sample period is from July 2006 to December 2014.

. . .

.

| | Lendable(%) | Lending(%) | LendingNum | Lendable(%) | Lending(%) | LendingNum |
|-----------------|-------------|------------|------------|-------------|------------|------------|
| RFY_Holding | 0.309*** | 0.044*** | 1.900*** | 0.339*** | 0.037*** | 2.050** |
| | (21.73) | (12.75) | (6.26) | (16.04) | (8.25) | (2.04) |
| Equity lendable | | | | 15.337*** | 1.750** | -71.731 |
| 1 0 | | | | (3.93) | (2.19) | (-0.80) |
| Bond liquidity | | | | -0.094 | -0.054 | -3.745 |
| | | | | (-0.50) | (-1.24) | (-0.62) |
| SIZE | | | | -0.720 | -0.188 | 24.183 |
| | | | | (-1.43) | (-0.97) | (1.46) |
| LEV | | | | -13.243*** | -0.600 | 119.598 |
| | | | | (-3.10) | (-0.71) | (1.02) |
| B/M | | | | -2.195*** | -0.078 | 26.417 |
| | | | | (-5.49) | (-0.81) | (1.62) |
| ROA | | | | 0.088*** | -0.010 | -0.972 |
| | | | | (2.68) | (-1.11) | (-0.84) |
| TAN | | | | -0.064 | -0.019 | 0.362 |
| | | | | (-1.43) | (-1.30) | (0.27) |
| DISP | | | | -2.612*** | 0.148 | 84.262 |
| | | | | (-3.32) | (1.09) | (1.37) |
| RATING | | | | -0.025 | -0.020 | 13.566 |
| | | | | (-0.09) | (-0.30) | (1.47) |
| Firm FE | Y | Υ | Υ | Y | Y | Ŷ |
| Time FE | Υ | Y | Υ | Υ | Y | Υ |
| Cluster | Υ | Y | Υ | Υ | Y | Υ |
| Obs | 279830 | 206172 | 206172 | 52488 | 46809 | 46809 |
| Adj R^2 | 0.457 | 0.273 | 0.181 | 0.397 | 0.193 | 0.184 |

35

| | LT Lendable | LT Lending | LT LendingNum | LT Lendable | LT Lending | LT LendingNum |
|--------------------------|-------------|------------|---------------|-------------|------------|---------------|
| LT RFY_Holding | 0.436*** | 0.338*** | 0.337*** | 0.092*** | 0.080*** | 0.050** |
| U | (32.44) | (23.74) | (23.33) | (5.47) | (3.20) | (2.09) |
| Equity lendable | · · · | | | -0.055 | -0.080 | -0.125 |
| | | | | (-1.09) | (-0.88) | (-1.48) |
| LT bond liquidity | | | | -0.010*** | -0.005 | -0.009 |
| | | | | (-2.68) | (-0.62) | (-1.35) |
| SIZE | | | | 0.001 | -0.005 | 0.022 |
| | | | | (0.08) | (-0.25) | (1.33) |
| LEV | | | | 0.000 | 0.011 | 0.139 |
| | | | | (0.01) | (0.10) | (1.59) |
| B/M | | | | -0.003 | -0.022* | -0.013 |
| | | | | (-0.45) | (-1.93) | (-1.38) |
| ROA | | | | 0.001 | 0.001 | -0.000 |
| | | | | (1.05) | (0.60) | (-0.14) |
| TAN | | | | 0.000 | 0.001 | 0.000 |
| | | | | (0.71) | (0.46) | (0.22) |
| DISP | | | | 0.023^{*} | -0.004 | -0.027 |
| | | | | (1.91) | (-0.28) | (-1.13) |
| RATING | | | | 0.001 | -0.017** | -0.012* |
| | | | | (0.24) | (-2.12) | (-1.77) |
| Firm FE | Υ | Υ | Υ | Y | Y | Y |
| Time FE | Υ | Υ | Υ | Υ | Υ | Y |
| Cluster | Υ | Υ | Υ | Υ | Υ | Y |
| Obs | 50967 | 39662 | 39662 | 6837 | 6752 | 6752 |
| $\operatorname{Adj} R^2$ | 0.679 | 0.418 | 0.471 | 0.430 | 0.280 | 0.262 |

Panel B: Firm-level prediction regression with a tilt of maturity niche

36

Table 5: Lender Preference and Future Bond Issuance

This table examines the impact of lender preference on future bond issuance. The dependent variable is LT bond issuance, a dummy variable that is equal to 1 if firm i issues one or more long-term bonds in year t+1, and 0 otherwise. A bond is identified as the long-term bond if it has more than seven years remaining to maturity. We report the OLS regression results in Columns (1)-(3) and the logit regression results in Columns (4)-(6). The sample contains all corporate bonds issued by the U.S. public firms excluding convertible bonds. We consider two proxies of lender preference. The first proxy is LT bond lendable-Firm, the total lendable amount of long-term bonds scaled by the total outstanding amount of long-term bonds by firm i. The second proxy is LT bond lendable-Mkt, the total lendable amount of long-term corporate bonds across all firms in the sample scaled by these bonds' outstanding amount. Control variables include LT bond outstanding-Firm, the total outstanding amount of long-term bonds by firm i scaled by the total outstanding amount of all bonds by the same firm; LT Treasury outstanding, the total outstanding amount of long-term Treasury bonds scaled by the total outstanding amount of all Treasury bonds; LT bond outstanding-Mkt, the total outstanding amount of long-term bonds across all firms in the sample scaled by the total outstanding amount of all bonds by these firms; Equity lendable, the total lendable amount of equities by firm i scaled by the market capitalization; LT bond liquidity, the value-weighted liquidity of long-term bonds by firm i scaled by the value-weighted liquidity of all bonds by the same firm, where bond liquidity takes the Amihud (2002) measure; SIZE, the logarithm of a firm's total asset; LEV, the leverage ratio; B/M, the book-to-market ratio; ROA, return on assets; TAN, the tangible ratio defined in Almeida and Campello (2007); DISP, the standard deviation of one-year ahead forecast on firm i's earnings across analysts reported in I/B/E/S dataset; and RATING, the S&P's long-term firm-level rating. The independent variables take the end-of-year values and lag the dependent variable for one year. The sample period is 2005-2014. t-statistics are reported in parentheses with the significance of 1%(***), 5%(**), and 10%(*), respectively.

| | Depend | lent Variable = | = LT bond issua | nce $[t+1]$ | | |
|-------------------------------|-----------|-----------------|-----------------|-------------|-------------|-------------|
| | | OLS | | | Logit | |
| | (1) | (2) | (3) | (4) | (5) | (6) |
| LT bond lendable-Firm | 0.149* | 0.222*** | 0.210*** | 0.749^{*} | 1.165*** | 1.134*** |
| | (1.85) | (2.87) | (2.69) | (1.65) | (2.89) | (2.74) |
| LT bond outstanding-Firm | -0.001*** | -0.001 | -0.001 | -0.008** | -0.003 | -0.004 |
| | (-2.61) | (-1.06) | (-1.46) | (-2.27) | (-1.01) | (-1.36) |
| LT bond lendable-Mkt | | -0.010 | 0.052 | | -0.130 | 0.084 |
| | | (-0.03) | (0.15) | | (-0.08) | (0.05) |
| LT Treasury outstanding | | -0.007 | -0.010* | | -0.037 | -0.052* |
| | | (-1.27) | (-1.75) | | (-1.26) | (-1.76) |
| $LT \ bond \ outstanding-Mkt$ | | -0.008 | -0.009 | | -0.041 | -0.046 |
| Ū. | | (-0.75) | (-0.83) | | (-0.79) | (-0.89) |
| Equity lendable | -0.128 | -0.165 | -0.212 | -1.253 | -0.788 | -1.082 |
| | (-0.58) | (-0.81) | (-1.03) | (-0.93) | (-0.77) | (-1.02) |
| LT bond liquidity | 0.034 | 0.041^{*} | 0.041* | 0.188 | 0.217^{*} | 0.214^{*} |
| 1 | (1.61) | (1.78) | (1.78) | (1.51) | (1.85) | (1.81) |
| SIZE | -0.032 | -0.112* | -0.142** | -0.108 | -0.497 | -0.644* |
| | (-0.91) | (-1.90) | (-2.15) | (-0.38) | (-1.61) | (-1.85) |
| LEV | -0.670*** | -0.865*** | -0.782*** | -3.797*** | -4.015*** | -3.610*** |
| | (-4.18) | (-4.75) | (-4.21) | (-3.56) | (-4.36) | (-3.82) |
| B/M | -0.109*** | -0.065** | -0.050* | -0.796*** | -0.306** | -0.236* |
| , | (-3.97) | (-2.50) | (-1.79) | (-3.71) | (-2.32) | (-1.70) |
| ROA | 0.001 | -0.002 | -0.002 | 0.005 | -0.008 | -0.011 |
| | (0.41) | (-0.69) | (-1.02) | (0.37) | (-0.70) | (-0.95) |
| TAN | 0.000 | 0.003 | 0.002 | 0.003 | 0.013 | 0.012 |
| | (0.22) | (1.12) | (1.04) | (0.23) | (1.12) | (0.97) |
| DISP | -0.040 | -0.040 | -0.015 | -0.523 | -0.332 | -0.132 |
| | (-0.91) | (-0.97) | (-0.40) | (-0.70) | (-0.80) | (-0.42) |
| RATING | · · · · | × , | -0.042*** | () | · · · · | -0.218*** |
| | | | (-3.07) | | | (-2.88) |
| Cluster Firm | Υ | Υ | Ý | Υ | Υ | Ý |
| Firm FE | Υ | Υ | Υ | Υ | Υ | Υ |
| Rating [*] Time FE | Υ | Ν | Ν | Y | Ν | Ν |
| Observation | 2913 | 2913 | 2913 | 2421 | 2421 | 2421 |
| Adj. or Pseudo \mathbb{R}^2 | 0.195 | 0.094 | 0.098 | 0.209 | 0.030 | 0.036 |
| | | | 37 | | | |

Table 6: Lender Preference and Future Bond Yield Spread

This table examines the impact of lender preference on future bond yield spread. The dependent variable is the valueweighted yield spread across all long-term bonds of firm i in month t+1, where the bond-level yield spread is the difference of a bond's yield-to-maturity and corresponding Treasury bond yield with the same duration. A bond is identified as the long-term bond if the bond has more than seven years remaining to maturity. The sample contains all corporate bonds issued by the U.S. public firms excluding convertible bonds. We consider two proxies of bond lending ability. The first proxy is LT bond lendable-Firm, the total lendable amount of long-term bonds scaled by total outstanding amount of long-term bonds by firm i. The second proxy is LT bond lendable-Mkt, the total lendable amount of long-term corporate bonds across all firms in the sample scaled by these bonds' outstanding amount. Control variables include LT bond outstanding-Firm, the total outstanding amount of long-term bonds by firm i scaled by the total outstanding amount of all bonds by the same firm; LT Treasury outstanding, the total outstanding amount of long-term Treasury bonds scaled by the total outstanding amount of all Treasury bonds; LT bond outstanding-Mkt, the total outstanding amount of long-term bonds across all firms in the sample scaled by the total outstanding amount of all bonds by these firms; Equity lendable, the total lendable amount of equities by firm i scaled by the market capitalization; LT bond *liquidity*, the value-weighted liquidity of long-term bonds by firm i scaled by the value-weighted liquidity of all bonds by the same firm, where bond liquidity takes the Amihud (2002) measure; SIZE, the logarithm of a firm's total asset; LEV, the leverage ratio; B/M, the book-to-market ratio; ROA, return on assets; TAN, the tangible ratio defined in Almeida and Campello (2007); DISP, the standard deviation of one-year ahead forecast on firm i's earnings across analysts reported in I/B/E/S dataset; and RATING, the S&P's long-term firm-level rating. All explanatory variables take the end-of-month value and are one-month lagged from the dependent variable. For firm characteristics, we uses the end-of-previous year value as the value in month t. The sample period is from January 2005 to December 2014. t-statistics are reported in the parentheses with the significance of 1% (***), 5%(**), and 10%(*), respectively.

Dependent variable = LT yield spread, $Yield_{i,L}[t+1]$

| | (1) | (2) | (3) |
|--------------------------|-----------|-------------|-------------|
| LT bond lendable-Firm | -2.263*** | | -1.385*** |
| | (-5.29) | | (-3.34) |
| LT bond outstanding-Firm | -0.001 | | 0.000 |
| 0 | (-0.24) | | (0.02) |
| LT bond lendable-Mkt | × , | -14.211*** | -12.445*** |
| | | (-10.90) | (-10.76) |
| LT Treasury outstanding | | -0.112** | -0.108** |
| 0 0 | | (-2.41) | (-2.32) |
| LT bond outstanding-Mkt | | -0.168*** | -0.171*** |
| 5 | | (-7.31) | (-7.38) |
| Equity lendable | 0.781 | 1.445** | 1.537** |
| 1 | (1.24) | (2.23) | (2.34) |
| LT bond liquidity | -0.030 | -0.033 | -0.037 |
| | (-1.21) | (-1.35) | (-1.52) |
| SIZE | -0.167 | -0.213* | -0.188* |
| | (-1.50) | (-1.92) | (-1.72) |
| LEV | 1.735*** | 1.781*** | 1.770*** |
| | (3.50) | (3.58) | (3.59) |
| B/M | 0.493*** | 0.541*** | 0.513*** |
| / | (2.98) | (3.21) | (3.06) |
| ROA | -0.025*** | -0.026*** | -0.025*** |
| | (-4.87) | (-4.89) | (-4.83) |
| TAN | 0.009* | 0.010^{*} | 0.009^{*} |
| | (1.66) | (1.96) | (1.75) |
| DISP | 0.457** | 0.508*** | 0.486** |
| | (2.38) | (2.60) | (2.54) |
| Cluster Firm | Y | Y | Ŷ |
| Firm FE | Υ | Y | Υ |
| Rating*Time FE | Ŷ | Ŷ | Ŷ |
| Observation | 20957 | 20957 | 20957 |
| Adj. R^2 | 0.618 | 0.626 | 0.628 |

38

Table 7: Lender Preference and Bond Expected Return

This table examines the impact of lender preference on future bond return. The dependent variable is the value-weighted return across long-term bonds of firm i in month t+1. A bond is identified as the long-term bond if the bond has more than seven years remaining to maturity. The sample contains all corporate bonds issued by the U.S. public firms excluding convertible bonds. We consider two proxies of bond lending ability. The first proxy is LT bond lendable-Firm, the total lendable amount of long-term bonds scaled by total outstanding amount of long-term bonds by firm i. The second proxy is LT bond lendable-Mkt, the total lendable amount of long-term corporate bonds across all firms in the sample scaled by these bonds' outstanding amount. Control variables include LT bond outstanding-Firm, the total outstanding amount of long-term bonds by firm i scaled by the total outstanding amount of all bonds by the same firm; LT Treasury outstanding, the total outstanding amount of long-term Treasury bonds scaled by the total outstanding amount of all Treasury bonds; LT bond outstanding-Mkt, the total outstanding amount of long-term bonds across all firms in the sample scaled by the total outstanding amount of all bonds by these firms; Equity lendable, the total lendable amount of equities by firm i scaled by the market capitalization; LT bond liquidity, the value-weighted liquidity of longterm bonds by firm i scaled by the value-weighted liquidity of all bonds by the same firm, where bond liquidity takes the Amihud (2002) measure; SIZE, the logarithm of a firm's total asset; LEV, the leverage ratio; B/M, the book-to-market ratio; ROA, return on assets; TAN, the tangible ratio defined in Almeida and Campello (2007); DISP, the standard deviation of one-year ahead forecast on firm i's earnings across analysts reported in I/B/E/S dataset; and RATING, the S&P's long-term firm-level rating. All explanatory variables take the end-of-month value and are one-month lagged from the dependent variable. For firm characteristics, we uses the end-of-previous year value as the value in month t. The sample period is from January 2005 to December 2014. t-statistics are reported in the parentheses with the significance of 1% (***), 5%(**), and 10%(*), respectively.

Dependent Variable = LT bond return, $Ret_{i,L}[t+1]$

| | (1) | (2) | (3) |
|-----------------------------|-------------|------------|------------|
| LT bond lendable-Firm | -2.935*** | | -1.919*** |
| | (-6.89) | | (-4.72) |
| LT bond outstanding-Firm | -0.001 | | 0.000 |
| 5 | (-0.72) | | (0.25) |
| LT bond lendable-Mkt | | -20.731*** | -18.285*** |
| | | (-11.96) | (-10.53) |
| LT Treasury outstanding | | -0.914*** | -0.909*** |
| 5 5 | | (-11.47) | (-11.42) |
| LT bond outstanding-Mkt | | -0.774*** | -0.779*** |
| 5 | | (-17.36) | (-17.46) |
| Equity lendable | -4.220*** | -3.446*** | -3.319*** |
| 1 0 | (-5.89) | (-4.76) | (-4.63) |
| LT bond liquidity | 0.002 | -0.007 | -0.014 |
| 1 0 | (0.05) | (-0.17) | (-0.32) |
| SIZE | 0.106^{*} | 0.047 | 0.081 |
| | (1.73) | (0.80) | (1.33) |
| LEV | -1.141** | -1.068** | -1.090** |
| | (-2.46) | (-2.51) | (-2.45) |
| B/M | -0.490*** | -0.417*** | -0.456*** |
| , | (-3.49) | (-3.12) | (-3.37) |
| ROA | 0.008 | 0.006 | 0.008 |
| | (1.35) | (1.12) | (1.34) |
| TAN | 0.003 | 0.004 | 0.003 |
| | (0.60) | (0.99) | (0.61) |
| DISP | 0.084 | 0.150 | 0.121 |
| | (0.48) | (0.84) | (0.68) |
| Cluster Firm | Ŷ | Ŷ | Ŷ |
| Firm FE | Y | Y | Υ |
| Rating [*] Time FE | Y | Y | Υ |
| Observation | 20741 | 20741 | 20741 |
| Adj. R^2 | 0.039 | 0.062 | 0.063 |

Table 8: Lender Preference and Bond Issuance, Bond Pricing – IV Regressions

This table applies instrument variable regressions to re-examine the impact of lender preference on future bond issuance, future bond yield spread, and bond expected return. We instrument lender preference by the combination of firm-level long-term bond holding amount by insurance companies scaled by bond outstanding amount, LT bond holding, and the intersection of this variable with a regulation event. Here, Regulation is a dummy variable which takes value of 1 during 2010-2014, and 0 during 2005-2009, with the event year as t = 2010 when NAIC mandates insurance companies to disclose their security lending information. Lending market demand is proxied by LT bond lendable-Firm, the total lendable amount of long-term bonds scaled by total outstanding amount of long-term bonds by firm i. A bond is identified as the long-term bond if the bond has more than seven years remaining to maturity. Control variables include LT bond outstanding-Firm, the total outstanding amount of long-term bonds by firm i scaled by the total outstanding amount of all bonds by the same firm; Equity lendable, the total lendable amount of equities by firm i scaled by the market capitalization; LT bond liquidity, the value-weighted liquidity of long-term bonds by firm i scaled by the valueweighted liquidity of all bonds by the same firm, where bond liquidity takes the Amihud (2002) measure; SIZE, the logarithm of a firm's total asset; LEV, the leverage ratio; B/M, the book-to-market ratio; ROA, return on assets; TAN, the tangible ratio defined in Almeida and Campello (2007); and DISP, the standard deviation of one-year ahead forecast on firm i's earnings across analysts reported in I/B/E/S dataset. The sample period is from January 2005 to December 2014. t-statistics are reported in the parentheses with the significance of 1% (***), 5%(**), and 10%(*), respectively, based on standard errors clustered at the firm level.

| | Stage 1 | | Stage 2 | |
|------------------------------|---------------------------|--|-----------------------------------|-------------------------------|
| | LT bond lendable | LT Issuance | LT Yield | LT Return |
| LT bond holding | 0.260^{***} (9.67) | | | |
| LT bond holding * Regulation | -0.096*** (-3.27) | | | |
| LT bond lendable-Firm | × / | 0.134^{**} (2.38) | -3.050** (-2.27) | -1.856^{*} (-1.94) |
| LT bond outstanding-Firm | -0.000** (-2.44) | -0.001 (-0.53) | -0.001 (-0.37) | -0.001 (-0.30) |
| Equity lendable | 0.161^{***} (3.91) | 0.274 (1.00) | 0.910 (1.27) | -4.397^{***} (-6.09) |
| LT bond liquidity | -0.005*** (-3.45) | (1.00) 0.011 (0.50) | (-0.034) (-1.29) | 0.006 (0.14) |
| SIZE | 0.018** (2.11) | -0.118** (-2.07) | (-0.152) (-1.33) | (0.11) 0.086 (1.39) |
| LEV | (2.11) 0.018 (0.44) | -0.535^{**} (-2.24) | (1.00) 1.736^{***} (3.49) | (1.03) -1.146** (-2.56) |
| B/M | -0.016*** (-3.59) | (2.21) -0.040 (-1.14) | (0.10) 0.477^{***} (2.81) | -0.469^{***} (-3.29) |
| ROA | 0.001 (1.36) | (0.002) (0.72) | -0.025^{***} (-4.67) | (0.20) 0.007 (1.22) |
| TAN | -0.001 (-1.28) | (0.12) 0.001 (0.53) | (1.01) 0.008 (1.42) | (1.22) 0.004 (0.87) |
| DISP | -0.009 (-1.64) | -0.063 (-0.71) | (1.12) 0.445^{**} (2.36) | (0.01) (0.099) (0.56) |
| Cluster Firm | Ý | Ý | Ŷ | Ý |
| Firm FE | Y | Y | Υ | Υ |
| Rating*Time FE | Y | Y | Υ | Υ |
| Observation Adj. R^2 | $20958 \\ 0.720$ | $\begin{array}{c} 1848 \\ 0.196 \end{array}$ | $20949 \\ 0.617$ | $20733 \\ 0.038$ |

Table 9: Lender Preference in the Extreme Case: Negative Lending Fee

This table re-examines the impact of lender preference on bond issuance, bond yield spread, and bond return in the scenario of negative lending fee. Lending market demand is proxied by *LT bond lendable-Firm*, the total lendable amount of long-term bonds scaled by total outstanding amount of long-term bonds by firm *i*. A bond is identified as the long-term bond if the bond has more than seven years remaining to maturity. We also consider the intersection of lending demand with negative lending fee measured by *NegFee Ratio*, which is the ratio of the number of bonds with negative fee to the total number of bonds by firm *i* at time *t*. Control variables are the same as in Table 8. The sample period is 2005-2014. *t*-statistics are reported in the parentheses with the significance of 1% (***), 5%(**), and 10%(*), respectively.

| | LHS=LT Issuance | LHS=LT Yield | LHS=LT Return |
|------------------------------------|-----------------|--------------|---------------|
| LT bond lendable-Firm | 0.127 | -2.083*** | -2.438*** |
| | (1.37) | (-5.10) | (-5.40) |
| $LT \ bond \ lending 	imes NegFee$ | 0.128* | -2.782*** | -3.634*** |
| 0 0 | (1.71) | (-3.09) | (-2.63) |
| NegFee ratio | -0.046 | 1.858*** | 1.240** |
| - | (-0.66) | (4.89) | (2.36) |
| LT bond outstanding-Firm | -0.002** | -0.000 | -0.001 |
| Ū. | (-2.52) | (-0.14) | (-0.60) |
| Equity lendable | -0.132 | 0.756 | -4.130*** |
| | (-0.60) | (1.18) | (-5.78) |
| LT bond liquidity | 0.034 | -0.031 | 0.000 |
| ¥ 0 | (1.56) | (-1.23) | (0.00) |
| SIZE | -0.031 | -0.181 | 0.088 |
| | (-0.59) | (-1.61) | (1.39) |
| LEV | -0.668*** | 1.861*** | -1.123** |
| | (-3.80) | (3.70) | (-2.42) |
| B/M | -0.110*** | 0.510*** | -0.491*** |
| , | (-4.26) | (3.08) | (-3.48) |
| ROA | 0.001 | -0.024*** | 0.008 |
| | (0.42) | (-4.65) | (1.45) |
| TAN | 0.000 | 0.008 | 0.002 |
| | (0.19) | (1.42) | (0.43) |
| DISP | -0.040 | 0.459** | 0.095 |
| | (-0.86) | (2.44) | (0.55) |
| Cluster Firm | Y | Y | Y |
| Firm FE | Y | Y | Y |
| Rating [*] Time FE | Y | Y | Y |
| Observation | 2913 | 20957 | 20741 |
| Adj. R^2 | 0.195 | 0.625 | 0.039 |

Table 10: Lender Preference and Bond Issuance, Bond Pricing – Non-Financial Firms Regressions

This table re-examines the impact of lender preference on bond issuance, bond yield spread, and bond return for a subsample of non-financial firms. We repeat the panel regressions in Tables 5, 6 and 7 with the dependent variable as the long-term bond issuance, long-term bond yield spread, and long-term bond return. A bond is identified as the long-term bond if the bond has more than seven years remaining to maturity. We consider two proxies of lender preference. The first proxy is *LT bond lendable-Firm*, the total lendable amount of long-term bonds scaled by the total outstanding amount of long-term bonds' outstanding amount. Regression specifications and control variables are the same as in Tables 5, 6, and 7. The sample period is 2005-2014. *t*-statistics are reported in the parentheses with the significance of 1% (***), 5%(**), and 10%(*), respectively.

| | LHS=LT Issuance | | | LHS=LT Yield | | | LHS=LT Return | | |
|-----------------------------|-----------------|----------------|-----------|---------------|---------------|---------------|---------------|------------|-------------|
| | (1) | (2) | (3) | (4) | (5) | (6) | (7) | (8) | (9) |
| LT bond lendable-Firm | 0.163** | 0.237*** | 0.229*** | -1.837*** | | -0.935*** | -2.554*** | | -1.560*** |
| | (1.96) | (2.88) | (2.78) | (-6.07) | | (-3.12) | (-7.14) | | (-4.73) |
| LT bond outstanding-Firm | -0.001 | -0.000 | -0.000 | 0.000 | | 0.002 | -0.002 | | 0.001 |
| | (-1.62) | (-0.09) | (-0.40) | (0.15) | 14040*** | (0.49) | (-0.86) | 10 001*** | (0.35) |
| LT bond lendable-Mkt | | 0.032 | 0.095 | | -14.049*** | -12.875*** | | -19.631*** | -17.642*** |
| | | (0.09) | (0.26) | | (-11.55) | (-10.62) | | (-11.64) | (-10.46) |
| LT Treasury outstanding | | -0.015** | -0.017*** | | -0.132*** | -0.131*** | | -0.796*** | -0.792*** |
| | | (-2.54) | (-2.84) | | (-2.79) | (-2.75) | | (-10.11) | (-10.07) |
| LT bond outstanding- Mkt | | -0.007 | -0.007 | | -0.157*** | -0.160*** | | -0.741*** | -0.744*** |
| | | (-0.65) | (-0.69) | | (-7.24) | (-7.27) | | (-16.05) | (-16.12) |
| $Equity \ lendable$ | -0.251 | -0.201 | -0.243 | 0.796* | 1.626*** | 1.695*** | -3.797*** | -2.855*** | -2.754*** |
| | (-1.06) | (-0.92) | (-1.10) | (1.81) | (3.51) | (3.67) | (-6.18) | (-4.77) | (-4.55) |
| LT bond liquidity | 0.030 | 0.037 | 0.036 | -0.016 | -0.022 | -0.024 | 0.018 | 0.007 | 0.003 |
| | (1.39) | (1.61) | (1.61) | (-0.66) | (-0.87) | (-0.98) | (0.40) | (0.16) | (0.07) |
| SIZE | -0.115^{***} | -0.202*** | -0.226*** | -0.109 | -0.165 | -0.137 | 0.217^{**} | 0.129 | 0.180^{*} |
| | (-2.78) | (-4.69) | (-5.05) | (-0.77) | (-1.17) | (-0.97) | (2.14) | (1.26) | (1.79) |
| LEV | -0.837*** | -1.022^{***} | -0.932*** | 1.713^{***} | 1.771^{***} | 1.741^{***} | -1.041** | -0.961* | -0.990* |
| | (-5.13) | (-5.70) | (-5.07) | (3.04) | (3.12) | (3.08) | (-1.99) | (-1.97) | (-1.96) |
| B/M | -0.095*** | -0.054 | -0.044 | 0.198 | 0.254 | 0.225 | -0.472^{**} | -0.381* | -0.432** |
| | (-2.69) | (-1.45) | (-1.16) | (0.74) | (0.93) | (0.83) | (-2.12) | (-1.85) | (-2.02) |
| ROA | 0.001 | -0.002 | -0.002 | -0.028*** | -0.029*** | -0.028*** | 0.007 | 0.007 | 0.007 |
| | (0.32) | (-0.74) | (-0.98) | (-5.24) | (-5.17) | (-5.15) | (1.22) | (1.11) | (1.27) |
| TAN | -0.001 | 0.001 | 0.001 | 0.007 | 0.008 | 0.007 | 0.005 | 0.006 | 0.005 |
| | (-0.40) | (0.45) | (0.32) | (1.32) | (1.40) | (1.39) | (1.06) | (1.24) | (1.05) |
| DISP | -0.013 | -0.012 | 0.003 | 0.337^{**} | 0.379^{**} | 0.369^{**} | -0.014 | 0.041 | 0.021 |
| | (-0.30) | (-0.35) | (0.08) | (2.14) | (2.47) | (2.38) | (-0.09) | (0.26) | (0.14) |
| RATING | × , | . , | -0.032** | | . , | . , | . , | | . , |
| | | | (-2.36) | | | | | | |
| Cluster Firm | Υ | Υ | Ý | Υ | Υ | Y | Υ | Υ | Υ |
| Firm FE | Υ | Υ | Υ | Υ | Υ | Υ | Υ | Υ | Υ |
| Rating [*] Time FE | Υ | Ν | Ν | Υ | Υ | Υ | Υ | Υ | Υ |
| Observation | 2704 | 2704 | 2704 | 18315 | 18315 | 18315 | 18128 | 18128 | 18128 |
| Adj. R^2 | 0.194 | 0.102 | 0.104 | 0.661 | 0.672 | 0.673 | 0.040 | 0.062 | 0.063 |

42

Table 11: Main Results with Alternative Proxy of Lender Preference

This table re-examines the impact of lender preference on future bond issuance, future bond yield spread, and expected bond return by using a set of alternative proxies for lender preference. Instead of using the lendable variables, we use *LT bond lending-Firm*, the total lending amount of long-term bonds scaled by the total outstanding amount of long-term bonds by firm *i*, and *LT bond lending-Mkt*, the total lending amount of long-term bonds across all firms in the sample scaled by these bonds' outstanding amount. A bond is identified as the long-term bond if the bond has more than seven years remaining to maturity. We repeat the panel regressions in Tables 5, 6 and 7 with the dependent variable as the long-term bond issuance, long-term bond yield spread, and long-term bond return. Regression specifications and control variables are the same as in Table 5, 6, and 7. The sample period is 2005-2014. *t*-statistics are reported in the parentheses with the significance of 1% (***), 5%(**), and 10%(*), respectively.

| | LH | IS=LT Issuar | nce | | LHS=LT Yiel | ld | | LHS=LT Retu | ırn |
|-----------------------------|-----------|--------------|--------------|-----------|-------------|-------------|-----------|-------------|-------------|
| | (1) | (2) | (3) | (4) | (5) | (6) | (7) | (8) | (9) |
| LT bond lendable-Firm | 0.757* | 0.827* | 0.748* | -3.335*** | | -1.000* | -5.084*** | | -2.373** |
| | (1.75) | (1.74) | (1.68) | (-2.61) | | (-1.90) | (-4.64) | | (-2.51) |
| LT bond outstanding-Firm | -0.002*** | -0.001* | -0.001** | 0.000 | | 0.001 | -0.000 | | 0.001 |
| 5 | (-3.06) | (-1.67) | (-2.05) | (0.13) | | (0.36) | (-0.05) | | (0.81) |
| LT bond lendable-Mkt | · · · · | -4.194* | -3.699 | ~ / | -179.252*** | -178.300*** | × , | -202.018*** | -199.659*** |
| | | (-1.77) | (-1.54) | | (-13.12) | (-13.50) | | (-11.26) | (-11.13) |
| LT Treasury outstanding | | -0.004 | -0.007 | | 0.171*** | 0.170*** | | -0.577*** | -0.590*** |
| <i>.</i> | | (-0.55) | (-1.06) | | (3.82) | (3.79) | | (-8.34) | (-8.69) |
| LT bond outstanding-Mkt | | -0.014 | -0.015* | | -0.089*** | -0.090*** | | -0.643*** | -0.649*** |
| 5 | | (-1.52) | (-1.68) | | (-4.82) | (-4.79) | | (-16.18) | (-16.25) |
| Equity lendable | -0.124 | 0.083 | 0.041 | 0.446 | 1.947*** | 1.943*** | -4.741*** | -3.238*** | -3.339*** |
| | (-0.56) | (0.48) | (0.23) | (0.73) | (3.01) | (3.00) | (-6.42) | (-4.35) | (-4.49) |
| LT bond liquidity | 0.033 | 0.036 | 0.036 | -0.024 | -0.039 | -0.041* | 0.011 | -0.011 | -0.013 |
| Er conta nquitatog | (1.50) | (1.57) | (1.55) | (-0.98) | (-1.63) | (-1.67) | (0.27) | (-0.26) | (-0.30) |
| SIZE | -0.030 | -0.102* | -0.130** | -0.197* | -0.217** | -0.215** | 0.065 | 0.042 | 0.044 |
| ~122 | (-0.84) | (-1.78) | (-2.04) | (-1.75) | (-1.99) | (-1.98) | (1.15) | (0.73) | (0.77) |
| LEV | -0.686*** | -0.892*** | -0.816*** | 1.706*** | 1.807*** | 1.786*** | -1.206*** | -1.048** | -1.118*** |
| | (-4.24) | (-4.84) | (-4.35) | (3.38) | (3.66) | (3.59) | (-2.78) | (-2.47) | (-2.61) |
| B/M | -0.113*** | -0.075*** | -0.060** | 0.537*** | 0.547*** | 0.548*** | -0.432*** | -0.412*** | -0.412*** |
| 27.11 | (-4.11) | (-2.78) | (-2.08) | (3.24) | (3.22) | (3.22) | (-3.13) | (-3.09) | (-3.10) |
| ROA | 0.001 | -0.001 | -0.002 | -0.027*** | -0.026*** | -0.026*** | 0.005 | 0.007 | 0.006 |
| | (0.55) | (-0.41) | (-0.74) | (-5.09) | (-4.86) | (-4.90) | (0.78) | (1.10) | (0.96) |
| TAN | 0.001 | 0.002 | 0.002 | 0.011** | 0.009* | 0.010* | 0.006 | 0.004 | 0.004 |
| | (0.26) | (0.95) | (0.87) | (2.17) | (1.77) | (1.88) | (1.26) | (0.81) | (0.89) |
| DISP | -0.041 | -0.042 | -0.018 | 0.505** | 0.517*** | 0.535*** | 0.121 | 0.152 | 0.143 |
| 2101 | (-0.94) | (-0.97) | (-0.44) | (2.47) | (2.68) | (2.71) | (0.63) | (0.86) | (0.77) |
| RATING | (0.0 1) | (0.01) | -0.041*** | () | (=::::) | (==) | (0.00) | (0.00) | (0.1.1) |
| | | | (-2.93) | | | | | | |
| Cluster Firm | Υ | Υ | (2.55) Y | Y | Y | Y | Y | Υ | Υ |
| Firm FE | Ŷ | Ý | Ý | Ý | Ý | Ý | Ý | Ý | Ý |
| Rating [*] Time FE | Ŷ | N | N | Ý | Ý | Ý | Ý | Ý | Ý |
| Observation | 2879 | 2879 | 2879 | 20889 | 20957 | 20889 | 20679 | 20741 | 20679 |
| Adj. R^2 | 0.195 | 0.092 | 0.096 | 0.612 | 0.647 | 0.647 | 0.035 | 0.067 | 0.067 |

This table examines the impact of lender preference on the difference of corporate bond yield spread for bonds with and without covenants. The dependent variable is the difference of yield spread of long-term bonds with and without covenants by firm i in month t+1. A bond is identified as the long-term bond if the bond has more than seven years remaining to maturity. The sample contains all corporate bonds issued by the U.S. public firms excluding convertible bonds. We consider two proxies of lender preference. The first proxy is LT bond lendable-Firm, the total lendable amount of long-term bonds scaled by total outstanding amount of long-term bonds by firm i. The second proxy is LTbond lendable-Mkt, the total lendable amount of long-term corporate bonds across all firms in the sample scaled by these bonds' outstanding amount. Control variables include LT bond outstanding-Firm, the total outstanding amount of longterm bonds by firm i scaled by the total outstanding amount of all bonds by the same firm; LT Treasury outstanding, the total outstanding amount of long-term Treasury bonds scaled by the total outstanding amount of all Treasury bonds; LT bond outstanding-Mkt, the total outstanding amount of long-term bonds across all firms in the sample scaled by the total outstanding amount of all bonds by these firms; Equity lendable, the total lendable amount of equities by firm iscaled by the market capitalization; LT bond liquidity, the value-weighted liquidity of long-term bonds by firm i scaled by the value-weighted liquidity of all bonds by the same firm, where bond liquidity takes the Amihud (2002) measure; SIZE, the logarithm of a firm's total asset; LEV, the leverage ratio; B/M, the book-to-market ratio; ROA, return on assets; TAN, the tangible ratio defined in Almeida and Campello (2007); DISP, the standard deviation of one-year ahead forecast on firm i's earnings across analysts reported in I/B/E/S dataset; and RATING, the S&P's long-term firm-level rating. All explanatory variables take the end-of-month value and are one-month lagged from the dependent variable. For firm characteristics, we uses the end-of-previous-year value as the value in month t. The sample period is from January 2005 to December 2014. t-statistics are reported in the parentheses with the significance of 1% (***), $5\%(^{**})$, and $10\%(^{*})$, respectively.

Dependent Variable = $\left(\text{Yield}_{iL}^C - \text{Yield}_{iL}^{NC} \right) [t+1]$

| | | , | |
|-----------------------------|-------------|-----------|-------------|
| | (1) | (2) | (3) |
| LT bond lendable-Firm | -0.904 | | -1.250 |
| | (-0.50) | | (-0.60) |
| LT bond outstanding-Firm | 0.027^{*} | | 0.027^{*} |
| 5 | (1.74) | | (1.73) |
| LT bond lendable-Mkt | | 1.035 | 2.325 |
| | | (0.50) | (0.80) |
| LT Treasury outstanding | | -0.024 | -0.023 |
| 0 0 | | (-0.24) | (-0.25) |
| LT bond outstanding-Mkt | | -0.007 | -0.012 |
| 0 | | (-0.13) | (-0.22) |
| Equity lendable | -2.401** | -2.796*** | -2.532** |
| 1 0 | (-2.04) | (-2.17) | (-2.13) |
| LT bond liquidity | -0.044 | -0.058 | -0.039 |
| 1 0 | (-0.58) | (-0.66) | (-0.53) |
| SIZE | 0.883*** | 0.950** | 0.883*** |
| | (2.98) | (2.57) | (2.97) |
| LEV | -0.886 | -0.091 | -0.914 |
| | (-0.41) | (-0.04) | (-0.42) |
| B/M | -0.141 | -0.127 | -0.142 |
| / | (-0.74) | (-0.68) | (-0.75) |
| ROA | -0.031 | -0.051 | -0.030 |
| | (-0.74) | (-0.95) | (-0.71) |
| TAN | -0.018 | -0.033 | -0.017 |
| | (-0.74) | (-1.18) | (-0.72) |
| DISP | -1.593*** | -1.498*** | -1.613*** |
| | (-3.53) | (-2.97) | (-3.57) |
| Cluster Firm | Ý | Ý | Ý |
| Firm FE | Υ | Y | Υ |
| Rating [*] Time FE | Υ | Y | Υ |
| Observation | 2676 | 2676 | 2676 |
| Adj R^2 | 0.684 | 0.671 | 0.684 |