### The Journal of FINANCE

The Journal of THE AMERICAN FINANCE ASSOCIATION

THE JOURNAL OF FINANCE • VOL. LXXV, NO. 1 • FEBRUARY 2020

# Access to Collateral and the Democratization of Credit: France's Reform of the Napoleonic Security Code

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#### ABSTRACT

France's Ordonnance 2006-346 repudiated the notion of possessory ownership in the Napoleonic Code, easing the pledge of physical assets in a country where credit was highly concentrated. A differences-test strategy shows that firms operating newly pledgeable assets significantly increased their borrowing following the reform. Small, young, and financially constrained businesses benefitted the most, observing improved credit access and real-side outcomes. Start-ups emerged with higher "at-inception" leverage, located farther from large cities, with more assets-in-place than before. Their exit and bankruptcy rates declined. Spatial analyses show that the reform reached firms in rural areas, reducing credit access inequality across France's countryside.

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[Correction added on 21 November 2019 after first online publication: The first line of the legend of Table III directly below the second equation has been updated.]

DOI: 10.1111/jofi.12846

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To allow for a more equal access to credit, I wish to see a rapid easing of the pledge regime. Do I need to remind you that currently a borrower, for example, a company, has to hand over the property that it pledges? Do you know a modern country that works that way?

> —Pascal Clément, Minister of Justice, addressing the French Parliament on June 22, 2005

SEVERAL COUNTRIES USE SECURITY LAWS derived from the Napoleonic Code, a regime predicated on the notion of "possessory ownership." Under the highly formalized, centuries-old Code, physical assets are deemed to be "unique," "whole," and "nontransferable" (see Omar (2007) and Ancel (2008)). These legal fictions limit the types of security interests that can be written on productive assets and ultimately favor large, established, well-connected incumbents over small, young, innovative newcomers (see, e.g., Fleisig, Safavian, and de la Peña (2006)). Institutional arrangements of this kind have detrimental consequences for financial markets and economic development, but the critical mechanisms that underlie these connections—and their reach—are not fully understood. This paper shows how a recent reform in France informs knowledge about links between the legal contracting framework, access to credit (level and distributional effects), business formation, and real economic outcomes.

Ordonnance 2006-346 derogated the notion of possessory asset ownership in France, in existence since 1804. In doing so, the 2006 reform allowed French firms to control and operate (in-house) physical assets pledged to third parties. This seemingly simple statutory change significantly enlarged the menu of assets that firms could pledge in credit transactions, particularly hard movable assets used in modern business operations (such as machinery and equipment). In addition to expanding the set of assets that could be collateralized, the new regime allowed security interests to be charged to more than one party, making it feasible for loans to be syndicated under multiple creditors, multiple priority schemes, and multiple maturity structures. In further allowing for rechargeable interests, the reform also critically enhanced the pledgeability of hard immovable assets (land and buildings). The new law had no bearing on firms' ability to offer liquid assets as collateral. Notably, Ordonnance 2006-346 did not introduce changes related to the balance of power between contracting parties, asset seizure procedures, or judicial intervention. This starkly differentiates it from most other credit reforms, which have promoted the notion of "strengthening creditors' rights" as a way to ease credit access.

The wrinkles in the process through which France reformed its security code system provide unique insights into the distributional and wealth effects of easing access to collateral. Changing the legal framework governing asset ownership and alienability meant that firms were discretely yet differentially endowed with "new assets" that they could pledge in credit transactions. Nesting pairwise-matching in difference-in-differences (DID) estimations, we build on the prior that firms whose operations relied most intensely on hard assets could be favored by a reform that distinctly enhanced their ability to pledge that class of assets in credit agreements. In this setting, we contrast and compare

firms according to the types of assets more intensely used in their production processes (hard versus liquid), according to the nature of the contracts they sign (short term versus long term), their size, age, and credit access status ("financing constraints"), among several dimensions that help us trace how access to collateral shapes credit taking and corporate outcomes. We also gauge the broader economic consequences of this process, including spatial reach and allocation efficiency. Among the most innovative margins we consider is the impact of the collateral reform on start-ups, assessing effects that speak to the issues of business formation, growth, and survival.

We first study the effect of Ordonnance 2006-346 on firm credit using comprehensive data from Bureau van Dijk. We find that the reform significantly increased the debt-taking of French firms with no access to public markets along both the intensive margin (leverage ratios) and the extensive margin (propensity to take out any debt at all). Notably, the reform only affected long-term debt-taking (secured by hard assets). Using firms' fixed assets intensity to identify effect heterogeneity, we show that the increase in debt ratios and the decline in the proportion of "zero-leverage" firms occurred primarily among "high-fixed assets intensity" firms. In particular, while the long-term leverage ratio of high-fixed assets firms rose by about 7 percentage points after the reform, the long-term leverage ratio of low-fixed assets firms rose by a mere one point. The 6 percentage point difference is remarkable compared to the pre-reform average leverage ratio of only 1.4%. Confirming the logic of our test, short-term debt (which is not secured by hard assets) did not change across high- or lowfixed assets firms. All our tests have firms matched on several predetermined dimensions and account for firm- as well as industry-year fixed effects.

After establishing that firms operating assets contemplated by the 2006 collateral-menu reform are able to issue more secured debt, we look into a number of real-side outcomes. This is an important examination since previous work on credit expansion has warned researchers and policy-makers about credit that is indiscriminately awarded to "marginal borrowers" in the economy. We examine three sets of real outcomes in our matched-DID tests: firm spending, performance, and risk. Regarding the first set, we find that high-fixed assets firms spent significantly more in capital investment and labor employment after the collateral reform. Regarding the second, we find that those same firms observed higher sales and profitability rates in the years following the reform. Finally, we document that high-fixed assets firms observed a significant decline in profit volatility and, ultimately, a comparatively lower probability of filing for bankruptcy after the reform. Our analysis suggests that the 2006 collateral reform benefitted seemingly promising, creditworthy borrowers.

Our next step is to study whether the reform reached firms previously rationed in the credit market ("credit democratization"). We perform several sets

<sup>&</sup>lt;sup>1</sup> Assunção, Benmelech, and Silva (2014), for example, study a reform in Brazil that simplified the sale of repossessed cars used as collateral for auto loans. That reform led to higher credit availability and taking. However, it distinctively allowed for riskier borrowers to obtain loans for more expensive cars, ultimately triggering higher default rates.

of analyses on this front. We first break out our main tests across characteristics that commonly speak to firms' ability to access credit. In particular, we look at whether the collateral reform had significantly differential effects on firms that are small (as proxied by asset size and workforce), young (years in operation), or are classified as financially constrained according to a France-specific index of financial constraints based on the European Central Bank (ECB)/European Commission (EC) Survey on Access to Finance of Enterprises (SAFE). A matching-triple-differences test shows that these likely credit-rationed firms gained the most access to credit following the repudiation of possessory ownership. As an example, the average increase in the leverage ratios of high-fixed assets firms employing less than 35 employees (bottom quartile of the employment distribution) was twice as high as the leverage increase of high-fixed assets firms with more than 165 employees (top quartile of employment). Similar figures are attached to estimations across samples of firms classified as financially constrained in France vis-à-vis firms that do not fall into that classification. Under the same testing framework, we look at the real outcomes we considered for our aggregate sample (spending, performance, and risk). Our tests show that investment, hiring, sales, and profitability were particularly positively affected by the reform among high-fixed assets firms that were small, young, and financially constrained. At the same time, those subsets of firms were differentially more likely to observe reductions in profit volatility and failure rates.

Our base results suggest that *Ordonnance 2006-346* helped democratize credit access toward *existing firms* that likely starved for the funding of viable projects. Yet, the proceeding analysis left out a margin that is often ignored in the examination of credit reforms, namely, the establishment of *new firms*. We conduct such an examination using additional data from both Bureau van Dijk and the French Census (INSEE). In these tests, we are able to match start-ups in the same industry, incorporated in the same year, and located in the same French department.

We first show that the "at-inception" leverage ratios of start-up businesses operating more fixed assets increased significantly more following the collateral reform than the leverage ratios of industry-year-location-matched start-ups operating less fixed assets. For instance, the average leverage of high-fixed assets start-ups incorporated after 2006 was 13 percentage points higher than that of similar start-ups incorporated before 2006; this compared to only five points higher for low-fixed assets start-ups over the same time window. Next, we dig deeper into post-reform outcomes for start-ups, assessing the reform's impact on metrics that gauge business formation, growth, and survival. Among other results, we show that, after the collateral reform, start-ups operating more fixed assets were born geographically farther away from France's large cities, where access to finance is scarce and, when available, complicated by frictions commonly associated with physical distance between borrowers and financial providers (see, e.g., Agarwal and Hauswald (2010)). We also show that the initial size of start-ups operating more fixed assets increased with the reform (from US\$99,000 to US\$115,000, on average). In contrast, the size of industry-year-location-matched start-ups operating fewer fixed assets did not change. Our estimations also show that high-fixed assets start-ups grew faster after the collateral reform while the growth rate of matched low-fixed assets start-ups declined. Finally, we look at general exit and bankruptcy rates for start-ups in France around the reform as a function of these firms' fixed assets usage. General exit and bankruptcy rates of high-fixed assets start-ups became markedly lower than those of low-fixed assets start-ups after *Ordonnance 2006-346* (these rates were indistinguishable prior to the reform).<sup>2</sup>

We also look at the issue of credit democratization via a geography-based analysis of the reform's effects. Several studies emphasize the importance of firm location in accessing credit (e.g., Hauswald and Marquez (2006), Agarwal and Hauswald (2010), Granja, Leuz, and Rajan (2018)). A higher density of financial institutions, particularly in and around urban centers, reduces the informational cost of credit acquisition (e.g., DeYoung, Goldberg, and White (1999)). As such, firms located in rural areas face a significant disadvantage in accessing credit (e.g., Arena and Dewally (2012)). Using spatial-point analyses, we show that firms located away from metropolitan areas gained the most credit access from the collateral reform. We also compute a Gini index of corporate credit to gauge whether the reform reduced inequality in credit access within and across different jurisdictions in France. Before the reform, 90 of 96 French departments had a Gini index exceeding 0.90, implying that in virtually every department the credit market was dominated by a handful of large firms.<sup>3</sup> After the reform, only 19 departments registered an index above 0.90. Remarkably, the largest declines occurred in rural departments, far from the main French urban areas and financial centers. The geography-based analysis we present adds to the understanding of how economic policy percolates across a country, providing perspective to decision-makers concerning their policy goals.

We end our study by tracing the economic effects of the reform at the macrolevel. We run two sets of tests on this front. First, following Wurgler (2000), we use the sensitivity of capital investment growth to value-added growth as metric of the efficiency of the cross-sectoral capital allocation process within a country. Wurgler's efficiency sensitivity metric jumped from a pre-reform level of 0.48 to a post-reform level of 0.85. Notably, this increase in allocation efficiency was particularly more pronounced in industries with a larger fraction of high-fixed assets firms. We also use the external financing dependence proxy of Rajan and Zingales (1998) as an additional capital allocation efficiency metric. The reform raised long-term borrowing more pronouncedly in sectors that were more highly dependent on external financing. These results are also more significant for subsamples of small, young, and financially constrained firms. The bulk of our evidence suggests that the reform-induced

<sup>&</sup>lt;sup>2</sup> Our collateral-menu reform evidence is in tandem with findings by Schmalz, Sraer, and Thesmar (2017) showing that increases in home collateral values lead to increases in the probability of becoming an entrepreneur in France.

<sup>&</sup>lt;sup>3</sup> France's Gini index of corporate credit inequality was 0.95 before 2006, a high figure when compared to 0.82 in other comparable European Civil Law countries (Belgium, Italy, Portugal, and Spain).

changes to France's collateral regime improved the country's capital allocation process.

Our study contributes to the law and finance literature on various fronts. Most existing studies analyze cross-country bankruptcy regime differences (La-Porta et al. (1998), Djankov, McLiesh, and Shleifer (2007)) or within-country bankruptcy regime changes (Lilienfeld-Toal, Mookherjee, and Visaria (2012), Vig (2013)). In contrast, our focus is on collateral contracting, which carries different policy implications. We show how collateral regime changes can spur the democratization of credit, allowing small, young, profitable, start-up firms, and firms located in the countryside to access new credit facilities. We also show how collateral regime changes can bring about positive real-side implications at both the micro- and the macroeconomic levels. Critically, these outcomes can be achieved dispensing with the need to introduce often controversial and costly changes to the legal powers of contracting parties or changes to rules governing judicial intervention.

Our study also adds to recent research looking at how collateral affects bank credit. Cerqueiro, Ongena, and Roszbach (2016) show that reductions in collateral values may trigger increases in loan interest rates and reductions in credit limits. Calomiris et al. (2017) show that bank lending secured with movable assets is lower in countries with weaker collateral protection. Our study is different in that we focus on firms rather than banks, allowing us to make inferences about real-side implications of collateralized debt-taking. Closer to our paper, Campello and Larrain (2016) look at a collateral regime change in an emerging market (Romania). In contrast to their paper, our setting and data allow us to study the effects of collateral on several key dimensions such as start-ups' access to credit, firm survival, financial constraints, and economywide capital allocation. In addition, the spatial analyses we employ provide new insights into the regional dynamics of credit access distribution within a country.

Our paper is also related to the literature linking credit and economic development. Prior studies show that credit expansion may trigger waves of defaults and repossessions (White (2007), Keys et al. (2010), Mian and Sufi (2010), Assunção, Benmelech, and Silva (2014)). Others show that credit easing may lead to more business entry and greater economic activity (Benmelech and Moskowitz (2010), Chatterji and Seamans (2012)). We add to this literature by showing how collateral-induced credit creation can shape the capital allocation process. Our analysis shows that when and where credit markets become "deeper" due to an enhanced ability to pledge collateral, not only do existing firms use more external credit as a result, but new firms, too, use more debt than before at the start of their operations.

The remaining article is organized as follows. Section I discusses the French collateral reform. Section II describes our data and empirical methodology. Section III studies the overall effects of the reform on credit access and real-side variables. Section IV discusses credit democratization. Section V focuses on business formation, growth, and survival (start-up firms). Section VI

examines capital allocation efficiency. Section VII contains robustness checks. Section VIII concludes.

#### I. Institutional Setting: Security Laws in France

#### A. The Napoleonic Code of 1804

Until recently, security interests in France were governed by the 1804 Napoleonic Code. The codified system was predicated on the notion that borrowers had to be protected from exploitative creditors, while creditors had to be protected from borrowers refusing the surrender of collateral in default. To reconcile these interests, regulators established highly formal, costly procedures for the creation of security rights. As such, the 1804 Code would not recognize nonpossessory charges since assets pledged without dispossession could lead future creditors to "misapprehend a borrower's creditworthiness" (see Haimo (1983)). Ruling out nonpossessory charges meant that borrowers had to physically transfer pledged assets for creditors to validate—in the legal jargon, "perfect"—a security interest. This statute of the law had profound implications for borrowing. It implied that firms could not pledge assets to third parties while at the same time continuing to freely use and dispose of those assets in their regular (in-house) operations. Because assets were also deemed to be "unique" and "nonsubstitutable" under the Napoleonic Code, firms could not offer similar assets to secure a credit transaction. Security interests over "fungible assets" (such as oil, steel, etc.) or "future assets" (such as machinery and equipment under construction, or inventory in process) were also disallowed because such assets could not be easily identified and physically transferred to creditors. Finally, the Code would not recognize rechargeable mortgages ("hypothecs") since they could lead to conflicts about priority (see Ancel

The 1804 Code focused on interests over land. In the early 19<sup>th</sup> century, the French economic system was centered around land-based activities and law-makers deemed interests over other production assets as "of little relevance" (see Omar (2007)). As the need for modern financing demanded new securitization techniques, over the years the legislature filled gaps in the law with ad hoc regulation (Haimo (1983)). By the end of the 1990s, a total of 10 different nonpossessory security interests were legally identifiable, each of them pertaining to specific branches of trade or industry (see Goode (1974), Kieninger (2004)). Even for those industries, however, a number of aspects of nonpossessory interests rendered them ineffective in accessing credit. For example, as for equipment liens, interests could only be taken out if the borrowed money was used to acquire new equipment (equipment already in place could not serve as

<sup>&</sup>lt;sup>4</sup> Refusal to recognize nonpossessory charges is grounded in the centuries-old notion that only the physical possession of assets would unequivocally demonstrate a borrower's creditworthiness.

<sup>&</sup>lt;sup>5</sup> Examples include nonpossessory security interests issued to the wine industry following the devastating phylloxera plague of the 1860s and to the French moviemaking industry in the 1940s.

collateral). Notably, holders of those liens were junior to a number of other creditors in bankruptcy. Perhaps most troubling were difficulties in ascertaining the very definition of equipment. Each one of the existing classes of nonpossessory interests had their own independent definition of "securitizable assets."

The cumulative effect of this approach was a lack of consistency in requirements for creating and perfecting security interests over different types of assets. As a result, security interests over fixed assets were hardly ever used. This is made clear by evidence in Davydenko and Franks (2008), who show that less than 20% of assets pledged as collateral before the 2006 reform were composed of hard assets such as real estate or machinery and equipment (see panel A of table VI of their paper). Likewise, alternative sources of financing not requiring collateral, such as sale-leasebacks, and more generally, lease agreements, were not commonly used in France during that time. This has been attributed to the strong protection afforded to lessees regarding the termination and renewal of lease agreements (see Haimo (1983)).<sup>6</sup> On average, only 11% of the country's total gross fixed investment was funded through leasing. This figure is small compared to 26% for the United States, 17% for Germany, and 13% for other European Civil Law countries (see the 2009 Annual Report of Leaseurope and the 2015 Annual Report of White Clark Group).

#### B. Reforming the Napoleonic Code: Ordonnance 2006-346

In the early 2000s, France's outdated security laws became a topic of much policy debate (see Renaudin (2013)). In March 2005, President Chirac asked the Minister of Justice to reform the country's security regime. In June, the French Parliament passed Law 2005-842 on "Trust and Modernization of the Economy," enabling the government to reform security laws by way of *Ordonnance* (government order). Under this exceptional mandate, the central government could pass laws on economic matters without further congressional approval. In March 2006, the French government enacted a sweeping reform of the country's security laws.

Ordonnance 2006-346 transformed the law and practice of secured credit transactions in France (Ancel (2008), Renaudin (2013), Castellano (2015), Riffard (2016)). The reform repudiated the notion of possessory ownership by stating that a charge could be created on any present or future, tangible or intangible, or group of movable assets (Articles 2333 and 2355), provided they could be identified through a written description (Article 2336). The new nonpossessory charges were given legal priority over pre-existing possessory charges. Notably, the reform also improved the status of security over immovable assets by allowing for rechargeable mortgages. That meant that existing

<sup>&</sup>lt;sup>6</sup> For example, at the expiration of a commercial lease, the lessee is entitled to an additional term of nine years provided the lessee has occupied the premises for three years. In the United States and German systems, in contrast, lessees are only entitled to a new lease at expiration when that option was part of the original agreement; lessors are not obliged to pay any compensation (Lofstedt and Baum (1993)).

and new mortgages would allow for sequential addition of new creditors, who could be granted rights that were more equal to those of pre-existing lien holders. The rechargeability feature significantly improved the use of immovable assets, such as real estate, as collateral in loan contracts (Omar (2007)).

The new law did not introduce "floating charges" (charges applying to the "general collection" of corporate assets). As such, the formal identification of assets legally recognizable and eligible for collateralized charges remained a key issue for credit access (see Herbet and Sabbah (2006), Ancel (2008)). This is important for our empirical analysis of the collateral law as this asset-specific eligibility feature (which only concerns movable and immovable fixed assets) can be observed and thus used for test identification.

#### C. Other Law Changes

Countries reforming their financial architecture often reconsider several existing institutions at the same time. One year before *Ordonnance 2006-346* was passed, a regulation was introduced in order to allow for preventive resolution of firms' financial difficulties prior to insolvency. The "2005 Safeguard Provision" had ambiguous provisions regarding the bankruptcy process. On the one hand, it made it easier for managers to strategically file for bankruptcy. On the other hand, it gave creditors new powers in bankruptcy court, such as the appointment of creditors' representatives and inspectors to assist creditors and judges.<sup>7</sup>

By all accounts, the 2005 provision failed to achieve its goals (see, e.g., Plantin, Thesmar, and Tirole (2013)). Government statistics show that fewer than 500 safeguard procedures were opened in each of the two years after the rule was passed. This figure dwarfs in comparison to about 2,500 standard fillings for in-court resolution recorded annually over the same period (Omar (2014)). Such regulatory failure was so flagrant that it prompted the French government to reform the 2005 provision several years later (see Plantin, Thesmar, and Tirole (2013) for additional discussion). Potential confounding effects of the 2005 provision with *Ordonnance 2006-346* thus seem improbable.<sup>8</sup>

The 2006 reform also aimed originally at strengthening creditors' rights by lifting a ban on out-of-court seizures of collateral in default. However, the French Parliament appointed two separate groups—accountable to different branches of government—to modernize security laws and bankruptcy laws.

<sup>&</sup>lt;sup>7</sup> Creditor-appointed inspectors retained the right to review any documents they wished to procure and to bring actions against the debtor, including claims for fraudulent conveyance. For larger companies (more than 250 employees), creditors were represented by two committees, one for financial institutions and another for trade creditors.

 $<sup>^8</sup>$  To further separate the effects of the two regulations, we conducted a robustness check on a subsample of French firms unaffected by the 2005 Safeguard Provision (those with fewer than 150 employees, which account for over 70% of our sample). Results in Table IA.I in the Internet Appendix show that the 2005 provision has no impact on our inferences. The Internet Appendix is available in the online version of this article on  $The\ Journal\ of\ Finance$  website.

The regime allows for	1804 Napoleonic Code Law		1970s/80s Nor	1970s/80s Noncodified Laws		2006 Security Law	
security interests that are	Liquid Assets	Hard Assets	Liquid Assets	Hard Assets	Liquid Assets	Hard Assets	
nonpossessory	NO	NO*	YES	NO	YES	YES	
rechargeable	NO	NO	YES	NO	YES	YES	

<sup>\*</sup>Immovables only.

**Figure 1. Comparison of French security law regimes**. The table compares the old French security law introduced by the Napoleonic Civil Law Code in 1804, the noncodified laws enacted in the late 1970s and early 1980s, and the new security law introduced by *Ordonnance 2006-346* in 2006.

No effort was made to ensure that reforms in the two areas would be synchronized. As such, several years after the 2006 reform, the bankruptcy code still suspends a creditor's right to seize collateral out-of-court. The failure to strengthen creditors' rights makes *Ordonnance 2006-346* unique, as it enlarged the contracting space without altering the balance of power between contracting parties, seizure procedures, or court involvement.

#### D. Noncodified Security Laws and Identification Strategy

Managers of large companies in major French cities had long recognized that the 1804 Security Code was outdated and costly to work with. In the 1970s and 1980s, their concerted lobbying spurred regulation on securitization practices that were purposefully not added to the Napoleonic Code. The most popular of these "noncodified laws" were the Dailly Law and the Pledge of Ready Money. The Dailly Law allowed firms to assign their receivables to nonbanking financial institutions in securitizing debt contracts. The Pledge of Ready Money allowed them to do the same using cash and cash equivalents. Both laws were remarkably modern insofar as they allowed borrowers to take out security interests over fungible assets and future assets, while granting super-priority rights to secured creditors in bankruptcy. In practice, these noncodified credit schemes allowed firms to sell receivables and other liquid assets to factoring companies.

Figure 1 provides an overview of the security law regimes in France since 1804. Relative to the Napoleonic Code, the noncodified laws of the 1970s and 1980s enhanced the pledgeability of *liquid assets* by allowing firms to create security interests over accounts receivable and other cash-like assets. The 2006 reform subsequently enhanced the pledgeability of *hard assets*. It did so by allowing for the creation of nonpossessory security interests over hard movable assets such as machinery and equipment, and by allowing for rechargeable security interests over hard immovable assets such as land and buildings.

We use the above wrinkles in the French security system to design our base firm-level identification strategy. Simply put, hard assets could not be easily

 $<sup>^9\,\</sup>mathrm{Bypassing}$  the formal Code was a way to facilitate their implementation on an "exceptional basis."

pledged as collateral before the 2006 reform, while liquid assets could be easily pledged. Accordingly, the 2006 reform is expected to have significantly affected the credit capacity of those firms whose pre-reform operations employed more fixed assets relative to firms operating more liquid assets. As we explain in detail below, our testing strategy is based on a combination of matching and differences-estimation tests in which we look at the impact of *Ordonnance 2006-346* on firms of different (pre-reform) asset mix composition, contrasting high- and low-fixed assets usage firms. Additional contrasts are introduced as the analysis considers progressively more granular questions regarding the impact of the 2006 collateral reform in France. <sup>10</sup>

#### II. Data and Methodology

#### A. Data

Our basic firm-level financial data and geographic information come from Bureau van Dijk's AMADEUS database, which covers the universe of firms from 35 European countries. Each release of the database contains only the most recent eight years of financial data per firm and excludes firms that became inactive more than four years ago. To avoid selection biases, we retrieve all data from each April release of the database between 2001 and 2011. We pool these data and delete duplicates. We collect data on French firms as well as on firms from other European Napoleonic-Code countries (Belgium, Italy, Portugal, and Spain). We exclude firms from the financial, services, utilities, and public administration sectors. Our base sample comprises private French firms with sales above 5 million euros, total assets above 5 million euros, and at least 10 employees (which is close to the EU's definition of "all firms except micro firms"). The sample contains 46,433 unique firms over the 2001 to 2009 period.

Our dedicated start-up analysis uses a separate database that includes 35,660 unique French firms from AMADEUS over the 2001 to 2009 period. We also gather information on business formation from France's National Institute of Statistics and Economic Studies (INSEE). Using this Census-type data source, we collect department-level statistics on start-ups. The relevant

<sup>&</sup>lt;sup>10</sup>We also exploit the observation that firms needed the services of factoring companies to pledge liquid assets. Notably, the operations of factoring companies in France were geographically fragmented, concentrated in a small set of departments containing large cities. This condition limited the geography of noncodified credit contracting since factors had a hard time obtaining accurate, timely information about firms located in the countryside (e.g., information about a firm's current accounts receivable is critical for factoring). Based on this additional wrinkle, we use firms' geographic proximity to factoring companies as an added condition modulating the effect of the 2006 reform. The results from this triple-differences test strategy are reported in Table IA.II in the Internet Appendix.

<sup>&</sup>lt;sup>11</sup> A firm is identified as a start-up if its year of incorporation corresponds to the year in which the firm first appears in the database and if the firm is not the result of a merger. AMADEUS further requires that the new entity must have some financial data to enter the database.

<sup>&</sup>lt;sup>12</sup> More information can be found at https://www.insee.fr/en/statistiques/series/102722714.

business start-up series come from the National Enterprise and Establishment Register Database (SIRENE). Any company, natural person, or legal entity is registered in that database when they first declare the starting of a business enterprise. The concept of start-ups used by INSEE is based on guidelines provided by the statistical office of the European Union (EUROSTAT).

Finally, we collect department-level data on employment from EUROSTAT. We use the United Nations' General Industrial Statistics (UNIDO) database (INDSTAT-4) to obtain data on capital formation and value-added for four-digit ISIC industries in France.

#### B. Variable Construction

#### B.1. Firm-Level Variables

We use a firm's fixed assets intensity in the pre-reform year, 2005, to determine its exposure to the collateral regime ("treatment status"). FixedAssets is fixed assets (mnemonic: fias) divided by total assets (toas). To study the reform's credit-taking effects, we look at total, long-term, and short-term leverage ratios. TotalLeverage is short-term debt (loan) plus long-term debt (ltdb) divided by total assets. ShortTermLeverage (LongTermLeverage) is shortterm (long-term) debt divided by total assets. We further define the dummy variables DummyNoShortTermDebt and DummyNoLongTermDebt as equal to 1 if the corresponding term-debt variable is zero, and 0 otherwise. To study firm-level real-side effects, we consider firms' investment, employment, sales, profitability, and profit volatility. *Investment* is the sum of the annual change in fixed capital plus the change in inventories (stock) scaled by total assets. Employees is the log number of employees (emp). Sales is the log of sales (sale). Profitability is earnings before interest and taxes (ebta) divided by total assets. Profit Volatility is the standard deviation of Profitability over the previous four years.

To study whether the reform led to "credit democratization," we look at subsamples of firms defined according to pre-reform asset size, number of employees, age, and financial constraints. Specifically, *Size* is the log of total assets in 2005. *Employees* is defined as above. *CompanyAge* is the log difference between 2005 and the year of incorporation. Financial constraints are measured according to the methodology of Ferrando et al. (2015), who create an index of financial constraints based on the ECB/EC SAFE survey. For France, the latter index is defined as

$$SAFEIndex_{i,t} = \alpha_s + 0.079 \times FinancialLeverage_{it} + 0.225 \times CoverageRatio_{it}$$
$$-0.971 \times ProfitMargin_{it} - 0.182 \times Tangibility_{it}$$
$$-2.085 \times Cash_{it} - 0.134 \times Assets_{it}, \tag{1}$$

where *FinancialLeverage* is current liabilities (culi) plus long-term debt divided by total assets. *CoverageRatio* is interest expenses (inte) scaled by earnings before interest and taxes. *ProfitMargin* is profit after taxes (plat) divided by total

assets. Tangibility is tangible fixed assets (tfas) divided by total assets. Cash is cash (cash) dividend by total assets. Assets is the log of one plus total assets, all averaged over the pre-reform period. The parameter  $\alpha_s$  denotes sector fixed effects. <sup>13</sup> We classify as severely financially constrained (unconstrained) those firms within the top (bottom) decile of the French SAFE index distribution. <sup>14</sup>

In the start-up analysis, we further study a firm's distance in kilometers to the closest of the five largest French cities (Paris, Lyon, Marseilles, Toulouse, and Lille) and its asset growth. To calculate DistanceTop5Cities, we measure the spherical distance between points i (a firm's location) and j (the location of the city center of one of the cities) using

$$Distance = \arccos(\text{deglatlon}) \times r, \tag{2}$$

where deglation is given by  $\cos(LAT_i)\cos(LGT_i)\cos(LGT_j)\cos(LGT_j) + \sin(LGT_i)\sin(LGT_j) + \cos(LAT_i)\sin(LGT_i)\sin(LGT_i)\sin(LGT_j); LGT_x$  ( $LAT_x$ ) is the longitude (latitude) of point x, and r is the radius of the earth (see Coval and Moskowitz (2001)). We obtain the longitudes and latitudes of the postal codes of each French firm and the city centers from geonames.org (4,445 postal codes). AssetGrowth is the annual log percentage change in fixed assets from the year of incorporation. Continuous variables are winsorized at the first and last percentiles each year.

#### B.2. Industry-Level Variables

We use four-digit ISIC sector-level data to study capital allocation efficiency. InvestmentGrowth (ValueAddedGrowth) is the natural log of the ratio of current gross fixed capital formation (value-added) to its one-year lagged value. <sup>15</sup> We also create an industry-level external financial dependence index

<sup>&</sup>lt;sup>13</sup> The four sectors used by the ECB are construction, trade, services, and industry.

<sup>&</sup>lt;sup>14</sup> The ECB categorizes firms as more or less financially constrained based on qualitative information from the SAFE survey. The SAFE survey is stratified across different sectors, euro area countries, firm age, and firm ownership and categorizes firms as more or less financially constrained based on their responses to the following: (1) they report loan applications that were rejected; (2) they report loan applications for which only a limited amount of credit was granted; (3) they report loan applications that were declined by the firms because the borrowing costs were too high; and (4) they did not apply for a loan for fear of rejection ("discouraged borrowers"). After the firms in the SAFE survey have been matched with financial data in AMADEUS, the ECB estimates the probability that a firm is financially constrained as a function of its financial leverage, coverage ratio, profit margin, tangibility, cash holdings, size, and industry using a probit model. We use the estimated coefficients from the probit model to calculate the SAFE index as in equation (1). A potential limitation of this approach is the stability of the coefficients, which means that the estimated coefficients may not apply to firms outside the estimation sample and estimation period (see, e.g., Hoberg and Maksimovic (2015)). Results based on the SAFE Index are consistent with those based on alternative proxies for financial constraints.

<sup>&</sup>lt;sup>15</sup> Both variables are GDP-deflated. Gross fixed capital formation is defined as the cost of new and used fixed assets minus the value of sales of used fixed assets, where fixed assets include land, buildings, and machinery and equipment. Value-added is the value of shipments of goods (output) minus the cost of intermediate goods and required services, with adjustments made for inventories

according to Rajan and Zingales (1998). That index is calculated as the median ratio of capital expenditures net of cash flows to total capital expenditures within each three-digit U.S. SIC industry, averaged over the 1975 to 2005 period.

#### C. Methodology

We use mean-differences estimators to gauge the debt financing effects and real effects of the collateral reform, comparing outcome variables across high- versus low-fixed assets utilization firms over the pre-reform (2001 to 2005) versus post-reform (2006 to 2009) periods. In particular, we estimate a series of multivariate regressions including fixed effects that can be compactly written as

$$Y_{i,t} = \alpha_i + \alpha_{k,t} + \beta Post_t \times Treated_i + \varepsilon_{i,t}, \tag{3}$$

where  $Y_{i,t}$  is the value of the outcome variable for firm i in year t, with  $Y_{i,t} \in \{LongTermLeverage, ShortTermLeverage, DummyNoLongTermDebt, DummyNoShortTermDebt, Investment, Employees, Sales, Profitability, ProfitVolatility\}. Post is a dummy variable equal to 1 for year 2006 onward, else 0. Treated is a dummy variable equal to 1 if firm <math>i$ 's 2005 fixed assets-to-total assets ratio is in the top quartile of that distribution, else  $0.^{16}$   $\alpha_i$  and  $\alpha_{k,t}$  are firm and interacted industry-year fixed effects, respectively. The industry fixed effects are based on French NAIF industry codes, equivalent to two-digit U.S. SIC codes. We cluster standard errors at the firm level. The  $\beta$  coefficient in equation (3) can be interpreted as a regression-based DID estimate after accounting for a host of fixed effects.

To ensure that our treated (high-fixed assets) firms and nontreated (low-fixed assets) firms are similar along important dimensions, we estimate DID regression (3) on a propensity score (PS) matched sample. To create the PS-matched sample, we estimate a logit model of *Treated* on *Size*, *CompanyAge*, *Employees*, *Profitability*, and *TotalLeverage*, using data from the pre-reform year (2005). We then match each firm from the top fixed assets quartile to a unique firm from the lower three quartiles according to the fitted value of the logit model, excluding pairs for which the distance exceeds 0.005 in the common support of the PS-matching line.

We also examine corporate default rates. Changes in default rates following a credit reform are arguably a direct measure of whether the reform may have inadvertently extended credit to risky marginal borrowers. We use a proportional Cox hazard model to fit the number of years until a firm fails.

of finished goods, work-in-progress, and raw materials. Following Wurgler (2000), both variables are trimmed to correct for extreme outliers.

 $<sup>^{16}</sup>$  Using alternative quantiles (such as quintiles or terciles) does not alter our inferences. The choice for our identification variable is guided by the natural trade-off between bias and efficiency one faces in these cases.

The model assumes that the hazard rate is given by

$$\lambda_{i,t} = \phi_t \exp(\beta Treated_i + \gamma Post_t \times Treated_i), \tag{4}$$

where the hazard rate,  $\lambda_{i,t}$ , is the probability of firm i failing at time t conditional on surviving until that time. We set the failure year equal to the year in which a firm's legal status changes from an active status to one of the failure statuses in AMADEUS (if it does so). The parameter  $\phi_t$  is the baseline hazard rate common to all firms. The exponential function allows for cross-sectional variation in the hazard rate. Using a partial likelihood estimator, we obtain estimates for  $\beta$  and  $\gamma$  without imposing any structure on  $\phi_t$  but accounting for right-censoring of the data. To ensure that treated and control firms have similar default risk before the reform, we also estimate hazard model (4) on a PS-matched sample.

#### III. Financial and Real Effects of the Collateral Reform

In this section, we analyze the effects of *Ordonnance 2006-346* on the average private French firm. We first verify that our treated and matched control firms are similar across observable characteristics in the pre-reform year. We then look at the credit-contracting effects of the reform. We conclude by examining the real effects spurred by the reform.

#### A. Pre-Reform Characteristics of Treated and Control Firms

Table I provides descriptive statistics for the treated, nontreated, and matched control firms calculated from pre-reform-year data. Panel A contrasts the mean values of the matching covariates across treated and nontreated firms, while Panel B contrasts covariates across treated and matched control firms. The table confirms that our matching procedure effectively reduces the differences between treated and control firms along critical observable dimensions. Panel A shows that the treated firms are generally larger, younger, more profitable, and more levered than the nontreated firms, whereas Panel B shows that the treated and matched control firms are statistically identical across the observable characteristics we consider, with all *p*-values above 0.20.

#### B. Effects on Credit

#### B.1. Univariate Results

Figures 2 to 4 take a first look at the debt financing effects of the collateral reform. Figure 2 depicts the mean total leverage ratios of firms in different

<sup>&</sup>lt;sup>17</sup> The failure statuses in the AMADEUS data set are "default of payment," "insolvency proceedings," "receivership," "bankruptcy," "dissolved (bankruptcy)," "dissolved (liquidation)," and "in liquidation."

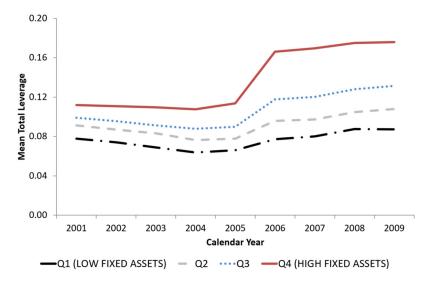
#### Table I Comparison of High- and Low-Fixed Assets Firms in the Pre-Reform Year

This table shows the mean values of several firm characteristics for the full sample of treated and nontreated firms (Panel A) and a propensity score (PS) matched sample of treated and control firms (Panel B) in the pre-reform year (2005). The firm characteristics are size, company age, number of employees, profitability, and total leverage. Size is the log of total assets. CompanyAge is the log difference between 2005 and the year of incorporation. Employees is the log of the number of employees. Profitability is earnings before interest and taxes scaled by assets. TotalLeverage is the sum of short-term and long-term debt scaled by assets. Treated firms are those with a 2005 fixed-to-total assets ratio in the top quartile of the distribution; nontreated firms are all other firms. Each treated firm is matched with one unique control firm. The table also shows the mean difference in the firm characteristics across treated and nontreated or matched control firms, with the p-value of the difference given in square brackets.

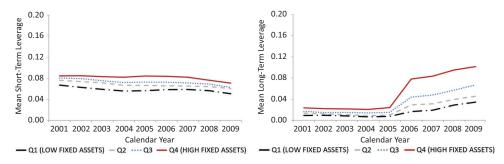
		Company		Prof-	Total
	Size	Age	Employees	itability	Leverage
	Panel A: Me	ans for Treated a	and Nontreated Fire	ns in 2005	
Treated	9.586	2.817	4.374	0.102	0.114
Nontreated	9.116	2.866	3.945	0.095	0.078
Difference	0.470	-0.049	0.429	0.007	0.036
<i>p</i> -Value	[0.00]	[0.00]	[0.00]	[0.00]	[0.00]
	Panel B: Means	for Treated and I	PS-Matched Control	Firms in 2005	
Treated	9.578	2.885	4.362	0.103	0.103
Controls	9.585	2.884	4.362	0.100	0.105
Difference	-0.007	0.001	0.000	0.003	-0.002
<i>p</i> -Value	[0.77]	[0.95]	[0.99]	[0.20]	[0.57]

fixed assets quartiles over our sample period. The figure suggests that the reform triggered an upward jump in debt-taking by French firms starting in 2006. The total debt-to-total assets ratio of our sample firms increased from a pre-reform average of 9% to a post-reform average of 12%. Remarkably, the effect of the reform is monotonically increasing in the rate with which firms employ fixed assets in their production process: the higher the use of fixed assets, the larger the debt-taking after the reform.

We next split total leverage into short-term and long-term leverage. Short-term debt in France is secured by liquid—rather than hard—assets (see Vernimmen, Quiry, and Le Fur (2014)). As such, one would not expect short-term debt to be directly affected by the reform. Accordingly, Figure 3 shows that the mean short-term leverage ratios of all fixed assets quartiles remain stable over our sample period. Long-term leverage ratios, in contrast, jump from a pre-reform average of 1% to a post-reform average of 5%. As in Figure 2, effect magnitudes increase monotonically over the range of fixed assets quartiles. The long-term leverage ratio of firms in the highest fixed



**Figure 2. Evolution of mean total leverage**. This figure shows the evolution of the mean total leverage ratio by fixed assets quartile (Q) over the 2001 to 2009 period. Q1, Q2, Q3, and Q4 indicate the first, second, third, and fourth fixed assets quartile, respectively. (Color figure can be viewed at wileyonlinelibrary.com)



**Figure 3. Evolution of mean short-term versus mean long-term leverage**. This figure shows the evolution of mean short-term and mean long-term leverage by fixed assets quartile (Q) over the 2001 to 2009 period. Q1, Q2, Q3, and Q4 indicate the first, second, third, and fourth fixed assets quartile, respectively. (Color figure can be viewed at wileyonlinelibrary.com)

assets quartile rises 7 percentage points from the pre-reform to the post-reform period, whereas that of firms in the lowest quartile rises by less than two points.

We also study the reform's effect on corporate debt-taking along the extensive margin. To do so, we consider the evolution of firms with no short-term or no long-term leverage (zero-leverage firms). Figure 4 reveals that the proportion of zero short-term leverage firms across all fixed assets quartiles remains low and stable throughout the sample period. In contrast, there are striking reductions in the proportions of zero long-term leverage firms in the reform

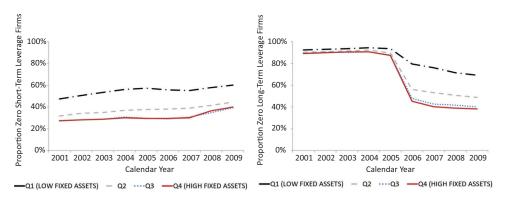


Figure 4. Evolution of the proportions of zero short-term leverage versus zero long-term leverage firms. This figure shows the evolution of the proportion of zero short-term and zero long-term leverage firms by fixed assets quartile (Q) over the 2001 to 2009 period. Q1, Q2, Q3, and Q4 indicate the first, second, third, and fourth fixed assets quartile, respectively. (Color figure can be viewed at wileyonlinelibrary.com)

year. In particular, the proportion of zero long-term leverage firms in our sample decreases from a pre-reform average of 91% to a post-reform average of 52%. As in Figures 2 and 3, the magnitudes of the reductions increase monotonically over the range of the fixed assets quartiles, with the highest fixed assets quartile firms observing the largest reduction (from 90% to 40%).

#### **B.2.** Regression Results

Table II presents results of the DID regression model (3) using all our debt-taking variables as outcomes. The table points to positive and significant effects of the reform on long-term debt-taking of high-fixed assets firms. The estimate on  $Post \times Treated$  in column (1) implies that high-fixed assets firms raised their long-term leverage by 2.6 percentage points more than their matched low-fixed assets firms following the reform. This is notable compared to the average long-term leverage of high-fixed assets firms prior to the reform, which was 2.3%. We further look at the effect of the 2006 reform on firms that did borrow before the reform (which we label "intensive margin") and those that did not borrow before the reform ("extensive margin"). The long-term leverage of high-fixed assets firms that borrowed long-term before the reform increased by 1.1 percentage points from before to after the reform (column (2)). While economically significant, this estimate is smaller than the full sample effect of 2.6%, suggesting that leverage ratio increases were particularly significant for firms that had not borrowed prior to the reform. Indeed, the proportion of high-fixed assets zero long-term leverage firms dropped by 10.8 percentage points more than the proportion of low-fixed assets zero long-term leverage firms (column (3)). Notably, columns (4) to (6) suggest that the reform did not change firms' short-term debt-taking. This result corroborates the

## Table II The Effect of the Collateral Reform on Leverage: Difference-in-Differences Matching Estimations

This table shows the results from the model estimation

$$Y_{i,t} = \alpha_i + \alpha_{k,t} + \beta Post_t \times Treated_i + \varepsilon_{i,t}$$

where Y is the long-term leverage ratio (columns (1) and (2)), a zero long-term debt dummy (column (3)), the short-term leverage ratio (columns (4) and (5)), or a zero short-term debt dummy (column (6)). Post is a dummy equal to 1 starting from 2006 onward, else 0. Treated is a dummy equal to 1 for firms with a 2005 fixed-to-total assets ratio in the top quartile of the distribution, else 0.  $\alpha_i$  and  $\alpha_{k,t}$  indicate firm and industry-year fixed effects, respectively. The "Intensive Margin" ("Extensive Margin") regressions in columns (2) and (5) (columns (3) and (6)) exclude firms with zero (positive) pre-reform debt. All regressions are run on a propensity score matched sample using 2005 values of size, age, number of employees, profitability, and total leverage as covariates. Each treated firm is matched with one unique control firm. t-Statistics (in parentheses) are calculated from standard errors clustered at the firm level. \*\*\*, \*\*, and \* indicate significance at the 99%, 95%, and 90% confidence levels, respectively.

	Long-Term Leverage (Treated by the Reform)				nort-Term Lev Treated by the	U
	Total (1)	Intensive Margin (2)	Extensive Margin (3)	Total (4)	Intensive Margin (5)	Extensive Margin (6)
$\overline{Post \times Treated}$	0.026*** (14.54)	0.011*** (2.98)	-0.108*** (-9.90)	0.000 (0.08)	0.000 (0.00)	-0.029 $(-0.97)$
Adjusted- $R^2$ Observations	0.07 89,826	0.02 $25,470$	$0.34 \\ 64,356$	0.01 89,826	0.01 86,457	$0.04 \\ 3,369$

internal logic of our tests in that short-term debt is not secured by hard assets and as such should not respond to the reform. 18

#### C. Real Effects

We next study how firms used the credit made available by the reform. If firms used their new financing to invest into profitable projects, the resulting changes in their performance could be seen as positive consequences of the credit reform. If, in contrast, the impact of the reform was simply to increase firm indebtness, one would worry about increased corporate default rates and other negative consequences of extending credit to marginal firms.

Table III shows the results from estimating regression model (3) using investment, employment, sales, profitability, and profit volatility as outcome

<sup>&</sup>lt;sup>18</sup> In the Internet Appendix, we explore alternative specifications of the models in Table II. In particular, Table IA.IV in the Internet Appendix reports results from models featuring 2005 control variables interacted with year dummies, Table IA.V in the Internet Appendix reports results from models using a more comprehensive set of *Post* dummies, and Table IA.VI in the Internet Appendix reports results from models explaining net long-term leverage (long-term debt minus cash scaled by total assets).

#### Table III

#### The Effect of the Collateral Reform on Firm Performance: Difference-in-Differences Matching Estimations

The first five columns of this table show the results from the model estimation

$$Y_{i,t} = \alpha_i + \alpha_{k,t} + \beta Post_t \times Treated_i + \varepsilon_{i,t}$$

while the final column shows the results from the proportional Cox hazard model estimation

$$\lambda_{i,t} = \phi_t \exp(\beta Treated_i + \gamma Post_t \times Treated_i).$$

Y is investment, employment, sales, profitability, or profit volatility. Investment is the sum of the annual change in fixed capital plus the change in inventories, scaled by total assets. Employees is the log of the number of employees. Sales is the log of sales. Profitability is earnings before interest and taxes scaled by assets. Profit Volatility is the standard deviation of profitability over the most recent four fiscal years. The hazard rate  $\lambda_{i,t}$  is the probability of firm i failing at time t conditional on surviving until then, and  $\phi_t$  is the baseline hazard rate common to all firms. We set a firm's failure year to the calendar year in which its legal status changes from an active status to one of the following failure statuses: "default of payment," "insolvency proceedings," "receivership," "bankruptcy," "dissolved," and "in liquidation." Post is a dummy equal to 1 starting from 2006 onward, else 0. Treated is a dummy equal to 1 for firms with a 2005 fixed-to-total assets ratio in the top quartile, else 0.  $\alpha_i$  and  $\alpha_{k,t}$  indicate firm and industry-year fixed effects, respectively. The regressions in columns (1) to (5) are run on a propensity score matched sample using 2005 values of size, age, number of employees, profitability, and total leverage as covariates. The estimation in column (6) is run on a within-year-and-industry propensity score matched sample using pre-reform average values of profitability, total leverage, and profit volatility as covariates. Each treated firm is matched with one unique control firm. t-Statistics (in parentheses) are calculated from standard errors clustered at the firm level. \*\*\*, \*\*, and \* indicate significance at the 99%, 95%, and 90% confidence levels, respectively.

	Investment (1)	Employees (2)	Sales (3)	Profitability (4)	Profit Volatility (5)	Hazard Rate (6)
$\overline{Post \times Treated}$	0.005*** (3.87)	0.030*** (2.91)	0.033*** (2.68)	0.004** (2.25)	-0.003*** $(-2.85)$	-1.169*** (-4.74)
Adjusted- $R^2$ Observations	0.09 81,539	0.01 77,360	0.02 89,288	0.01 89,405	$0.01 \\ 65,221$	0.01 $45,586$

variables in columns (1) to (5), respectively, and from estimating hazard model (4) in column (6). High- and low-fixed assets firms are again matched based on their pre-reform characteristics. Our estimates suggest that high-fixed assets firms, which are the firms that gained most credit access from the reform, invested more and hired more workers than matched low-fixed assets firms following the reform. The estimate in column (2), for example, suggests that high-fixed assets firms observed a 3 percentage point higher employment growth than low-fixed assets firms. High-fixed assets firms also observed higher sales and profitability (columns (3) and (4), respectively). Finally, those same firms seemingly became less risky (column (5)), and ultimately, their default rates dropped by about 70% ( $e^{-1.169}$ ) more than those of low-fixed assets firms (column (6)).

Taken together, our results suggest that *Ordonnance 2006-346* allowed firms operating more fixed assets to significantly raise their long-term debt-taking. Notably, the effects were more pronounced for those firms that did not borrow before the reform. *Ordonnance 2006-346* had markedly less pronounced effects on the long-term debt-taking of low-fixed assets firms, and it did not affect the short-term debt financing of either high- or low-fixed assets firms. Finally, the reform allowed high-fixed assets firms to invest in additional capital and labor, with these investments likely having spurred firms' increased sales and profitability and decreased volatility and default risk in the years following the reform.

#### IV. Credit Democratization

The term "credit democratization" has been used by policy-makers and academics in reference to the increased access to credit by individual borrowers and home buyers commonly neglected in loan markets (see, e.g., Grogan and Proscio (2000), Assunção, Benmelech, and Silva (2014), Livshits, Mac Gee, and Tertilt (2016)). Building on the previous narrative in the literature, we extend the scope of credit democratization to privately held firms in France, which traditionally have been owned by individuals or families (see, e.g., Bloch and Kremp (2002), Sraer and Thesmar (2007)). Firm location (distance from urban/financial centers), as well as characteristics such as size and age, have been identified as likely sources of financing frictions in markets such as the United States (e.g., Agarwal and Hauswald (2010), Hadlock and Pierce (2010)) and France (Dietsch (2003), Fonseca, Michaud, and Sopraseuth (2007)). As such, we start this section by investigating the geography of the distributional effects of Ordonnance 2006-346 on long-term debt-taking and credit access inequality across France. We then look at the differential effects of the reform on firms classified according to their asset size, number of employees, age, and financing constraints.

#### A. The Geography of the Reform's Effects

We use spatial-point analysis to study the distributional effects of the 2006 reform (see, e.g., Kaboski and Townsend (2012)). This geography-based investigation sheds light on how policy decisions carry different implications for various regions of a country (e.g., urban versus rural areas, economically developed versus underdeveloped areas). We do so at a granular level, estimating the probability distribution of changes in corporate credit-contracting across areas in France around the collateral reform. <sup>19</sup>

Spatial-point analysis allows us to determine and describe the extent to which the distribution of an event s in a geographic surface R exhibits regional heterogeneity ("clustering"). The function p(s) defines the probability

<sup>&</sup>lt;sup>19</sup> Figure IA.1 in the Internet Appendix shows further analysis on the distribution of debt-taking variables across departments before and after the reform.

of observing the event of interest in a certain location within R and can be estimated by means of nonparametric methods (e.g., kernel estimations). In our case, the surface R represents the French European territory, which we divide into a set of contiguous cells ("grid"). We choose to identify and analyze the following credit events around the reform: (1) companies with large increases in their long-term leverage ratios (5 percentage point or more), and (2) companies that did not have long-term leverage before the reform but have positive long-term leverage each year after the reform.

The French European territory is divided into 96 fairly uniformly sized departments. We first compute the frequency of companies satisfying condition (1) (alternatively, (2)) above in each of the 96 departments. We then compute the median value of that frequency across all departments. Next, we identify the geographic coordinates of the "centroids" of those departments with a frequency value above the median. Based on those coordinates, we follow Bailey and Gatrell (1995) in using kernel estimations to generate a spatially smooth estimate of p(s) over the entire grid of cells covering R. Each cell in the grid can comprise an arbitrarily small area. We divide the French territory into 30,000 cells and as a result each cell covers about 20 km². The estimation of the likelihood that firms in an area increase their long-term leverage according to the credit criteria we consider above allows us to build "heat maps" of the change in debt-taking across the French territory around the 2006 collateral reform.  $^{21}$ 

Figure 5 shows the heat maps one can generate with the procedure described above, with the map in Panel A focusing on increases in long-term leverage and the map in Panel B on declines in the proportion of zero long-term leverage firms. The deeper the red in either map, the higher is the probability that the firms located in the area experienced a large increase in their long-term debt-taking from before to after the reform. For geographic context, the black-rimmed areas represent those departments containing cities with more than 1 million inhabitants. Both maps clearly suggest that *Ordonnance 2006-346* produced significant increases in long-term debt-taking along both the intensive and the extensive margin across firms located in rural areas, that is, away from the large cities and the traditional credit markets. In fact, firms located in France's south western region—an area viewed as least economically developed (see, e.g, Dormard (2004))—seem to have gained the most credit access from the reform.

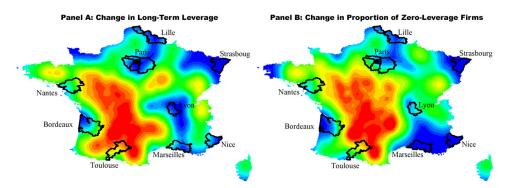
We use Moran's I statistic to examine whether the visual color clusterings in our maps are statistically significant. <sup>22</sup> To do so, we construct a Z-score based

$$I = \frac{n \sum_{k=1}^{N} \sum_{m=1}^{N} w_{(k,m)} (y_k - \bar{y}) (y_m - \bar{y})}{(\sum_{k=1}^{N} \sum_{m=1}^{N} w_{(k,m)}) \sum_{k=1}^{N} (y_k - \bar{y})^2},$$
(5)

<sup>&</sup>lt;sup>20</sup> Centroids are the points at the center of each department. Figure IA.2 in the Internet Appendix shows that French departments' capital cities are often located in the geographical center of their jurisdictions.

 $<sup>^{21}</sup>$  Put differently, we estimate the probability of observing a credit event of interest across each  $^{20}$  km $^{2}$  of the French territory and map the results.

 $<sup>^{22}</sup>$  Moran's I statistic is calculated as



**Figure 5.** The effects of the reform on long-term leverage financing. The maps depict the probability that the proportion of firms that experienced an above 5 percentage point increase in long-term leverage from before to after the reform lies above the median across departments in an area (Panel A) and that the proportion of firms with no long-term leverage before the reform but with a positive long-term leverage after the reform lies above the median across departments in an area (Panel B). The deeper red (blue) an area's color in the maps, the higher (lower) is the probability of an above median change. The black-rimmed departments contain cities with more than 1 million inhabitants.

on the mean and variance of Moran's I as

$$Z\text{-score} = \frac{I - E(I)}{\sqrt{\text{Var}(I)}},\tag{6}$$

where E(I) is the expected value of Moran's I under the null hypothesis of no spatial correlation. In other words, E(I) represents the case in which observations of the variable of interest (e.g., the fraction of firms with a 5 percentage point or more change in long-term leverage) are randomly distributed across departments with no identifiable pattern. The denominator, Var(I), is the variance of Moran's I.

Both maps in Figure 5 have positive and highly significant Moran's Z-scores, with the left map yielding a Z-score of 12.9 and the right map a Z-score of 8.9. In words, the geographic distribution of high and low values of the credit events of interest is far more spatially clustered than would be expected under a random process, implying that the firms observing the largest increases in long-term debt-taking after *Ordonnance 2006-346* are physically close

where n is the total number of observations for variable y. y represents either (1) the fraction of firms in each department with a 5 or more percentage point increase in long-term leverage from the pre-reform to the post-reform period or (2) the fraction of firms in each department with no long-term leverage before the reform but with positive long-term leverage after the reform. k and k are department indexes. k denotes a row-standardized binary weighted matrix in which each element k and k are less than 150 miles apart from each other, else 0. We use one observation of k for each department. Moran's k measures the spatial correlation between the value of each departmental observation with those of its neighbors. If the departmental observations of k are independent and identically distributed (iid), then Moran's k is asymptotically normal with expected value of  $\frac{1}{n-1}$  (see Ward and Gleditsch (2008)).

to each other and located in specific regions of the country. To corroborate our inferences about the reform's effect on corporate credit-taking along the intensive and extensive margins, we calculate the degree of overlap across the two maps in Figure 5 using the kernel estimates of the probability of occurrence of the two credit-taking events in each single cell.<sup>23</sup> Figure IA.3 in the Internet Appendix shows that the largest degree of overlap between the two maps occurs precisely in the deeper red areas (84%) and deeper blue areas (38%). The correlation between the probability distributions underlying the two maps is equal to 0.8, with a *p*-value of less than 0.01%.

#### B. The Reform's Effects on Credit Access Inequality

Our prior results suggest that *Ordonnance 2006-346* produced the largest increases in long-term debt-taking across rural firms that traditionally have less access to credit markets, consistent with the idea that the reform spurred a democratization of credit. To investigate this idea in more depth, we compute a Gini index of long-term debt usage to compare credit access inequality across France's regions before and after the reform. The Gini index is computed as

$$GiniIndex_{k,t} = \frac{1}{2\mu_{k,t}N_{k,t}^2} \sum_{i=1}^{N_{k,t}} \sum_{j=1}^{N_{k,t}} |LongTermDebt_{i,t} - LongTermDebt_{j,t}|, \quad (7)$$

where  $GiniIndex_{k,t}$  is department k's Gini index in year t.  $\mu_{k,t}$  is the average long-term debt of the firms in department k in year t. i and j are firm indexes.  $N_{k,t}$  is the number of firms in department k. We first calculate  $GiniIndex_{k,t}$  for each department k in each year t. We then average the index by department over the pre- and post-reform periods. Our calculations use a fixed number of observations (the 20,000 largest firms by total assets) in each year to ensure that our results are not driven by changes in sample size. The Gini index ranges from zero to one. A higher value indicates a more unequal distribution of long-term debt usage by firms in a department.

Figure 6 shows each department's Gini index, with Panel A focusing on the pre-reform period and Panel B on the post-reform period. Darker (lighter) blue departments have a relatively higher (lower) index value. Before the reform, 90 of the 96 French departments had a Gini index above 0.90, suggesting that long-term debt was heavily concentrated in the hands of a few large firms. Following the reform, the Gini index dropped significantly to 0.82.<sup>24</sup> Most notably, while

 $<sup>^{23}\,\</sup>mathrm{Additional}$  details on the construction of the overlapping measure are in the Internet Appendix.

<sup>&</sup>lt;sup>24</sup> The computed Gini index values can be interpreted as follows. Recall that before 2006, more than 90% of the firms in the country did not have any long-term debt. A Gini index of about 0.95 before 2006 is consistent with the illustrative case in which 1% of the firms in the population held almost 60% of debt, 9% of the firms held the remaining 40%, and 90% had no access to debt financing. After the reform, about 48% of the firms held some debt. A Gini index of about 0.82 after 2006 is then consistent with the case in which 1% of the firms held 30% of debt, 9% held slightly more than 30%, and 38% held the remaining 38%.

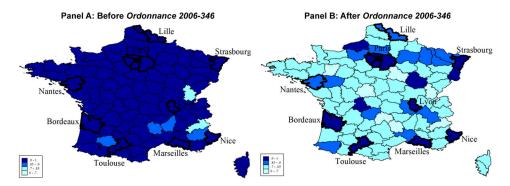


Figure 6. The effects of the reform on credit access inequality, by department. The maps depict each department's long-term debt Gini index for the pre-reform (Panel A) and the post-reform (Panel B) periods. We first calculate the Gini index by department and year and then average by department over the pre-reform (2001 to 2005) or post-reform (2006 to 2009) period. Darker (lighter) blue departments have a higher (lower) Gini index value. The black-rimmed departments contain cities with more than 1 million inhabitants.

all departments observed declines in their index values, it was the rural departments that experienced the most dramatic drops. The results are notable in suggesting that the collateral reform reduced inequality in the access to credit, with firms in the countryside experiencing the greatest gains in local credit access.

#### C. The Reform's Effects on Small, Young, and Constrained Firms

We now study whether the reform-led credit access reached firms traditionally rationed in the loan market. We first investigate the effects on firm debt-taking. Table IV presents the results from the long-term leverage regression of Table II, column (1) estimated separately on subsamples of firms characterized according to their pre-reform asset size (Panel A), number of employees (Panel B), company age (Panel C), and SAFE index-based measure of financial constraints (Panel D). The table contrasts small versus large firms, firms with few versus many employees, young versus old firms, and constrained versus unconstrained firms. <sup>25,26</sup> The regression estimates reveal

 $<sup>^{25}</sup>$  To define these subsamples we use the bottom/top quartile of the Size distribution, the bottom/top quartile of Employees, the below/above 30-year cut-off of CompanyAge, and the top/bottom decile of the SAFE index. In the case of the company age contrasts, we omit firms with an age implying that they could have been born within our sample period. We do so to avoid our results being driven by start-ups, which we analyze separately in Section V. Also, in the case of the hazard model estimations, we always contrast the bottom size, bottom number of employees, and top SAFE index quartiles with all remaining quartiles since there are too few failures in the top size, top number of employees, and bottom SAFE index quartiles to rely exclusively on these as contrasts.

<sup>&</sup>lt;sup>26</sup> A confounding effect we may face in our proposed subsample contrasts comes from the fact that the control firms were not completely unaffected by the reform. To address this issue, we choose to contrast the treated firms from each subsample against the control firms from both subsamples. We do so by estimating regression model (3) on pooled data adding a triple interaction

Table IV

## The Effect of the Collateral Reform on Leverage: Cross-Subsample Difference-in-Differences Matching Estimations

This table shows the results from the model estimation

$$Y_{i,t} = \alpha_i + \alpha_{k,t} + \beta Post_t \times Treated_i + \varepsilon_{i,t}$$

where the model is separately estimated on subsamples of firms characterized according to asset size (Panel A), number of employees (Panel B), company age (Panel C), and financial constraints (Panel D), with, however, the fixed effects restricted to be identical across subsamples. Y is the long-term leverage ratio. Post is a dummy equal to 1 starting from 2006 onward, else 0. Treated is a dummy equal to 1 for firms with a 2005 fixed-to-total assets ratio in the top quartile of that distribution, else 0.  $\alpha_i$  and  $\alpha_{k,t}$  indicate firm and industry-year fixed effects, respectively. The subsamples are firms with 2005 total assets in the bottom ("small") or top ("large") quartile, prereform number of employees in the bottom ("few") or top ("many") quartile, 2005 company age below ("young") or above ("old") 30 years, and pre-reform financial constraints above ("constrained") or below ("unconstrained") a critical value. We use the SAFE index to measure financial constraints. The table reports each subsample  $\beta$  as well as the cross-subsample difference in  $\beta$  ("Diff."). All regressions are run on a propensity score matched sample using 2005 values of size, age, number of employees, profitability, and total leverage as covariates. Each treated firm is matched with one unique control firm. t-Statistics (in parentheses) are calculated from standard errors clustered at the firm level. \*\*\*, \*\*, and \* indicate significance at the 99%, 95%, and 90% confidence levels, respectively.

	Panel A: Size-Based Sub	sample Contrasts	
	Small (1)	Large (2)	Diff. (1)–(2)
$\overline{Post \times Treated}$	0.032*** (9.72)	0.024*** (7.59)	0.008** (2.09)
Adjusted- $R^2$ Observations	0.14 $22,463$	0.03 $22,440$	
Pa	nel B: Number of Employees-B	ased Subsample Contrasts	
	Few (1)	Many (2)	Diff. (1)–(2)
$\overline{Post \times Treated}$	0.032*** (10.01)	0.015*** (5.10)	0.017*** (4.28)
Adjusted- $R^2$ Observations	0.01 22,468	0.01 $22,438$	
	Panel C: Company Age-Based	Subsample Contrasts	
	Young (1)	Old (2)	Diff. (1)–(2)
$\overline{Post \times Treated}$	0.028*** (11.46)	0.020*** (7.68)	0.008** (2.46)
Adjusted- $R^2$ Observations	0.05 43,457	0.10 27,056	

(Continued)

Panel D: Financial Constraints-Based Subsample Contrasts						
	Constrained (1)	Unconstrained (2)	Diff. (1)–(2)			
$\overline{Post \times Treated}$	0.026*** (5.16)	0.015*** (2.96)	0.011* (1.76)			
Adjusted- $R^2$ Observations	0.05 8,857	0.07 8,856				

Table IV—Continued

that the collateral reform led to significantly larger increases in long-term debt-taking among smaller firms, firms with fewer employees, younger firms, and more financially constrained firms. For example, the reform increased the long-term leverage of high-fixed assets firms employing less than 35 employees by an additional 1.7 percentage points compared to the long-term leverage of high-fixed assets firms with more than 165 employees (see Panel B).

We also investigate whether the greater gains in long-term leverage financing observed by small, young, and financially constrained firms had a positive effect on their real business activities. Table V reports results of the real outcomes and hazard model regressions of Table III, reestimated across the same subsamples of firms featured in Table IV. The estimations show that small, young, and financially constrained firms experienced significantly larger increases in investment and hiring, as well as sales and profitability, than large, old, and unconstrained companies (columns (1) to (4)). Panel A, for example, suggests that small high-fixed assets firms observed a 0.9 percentage point greater investment growth and a 12.5 point greater employment growth than large high-fixed assets firms following the reform. They also experienced larger increases in their sales and profit rates. These same firms also observed a decline in profit volatility and default rates (columns (5) and (6)). Results in Panel D suggest that the collateral reform reduced the default rates of financially constrained high-fixed assets firms by an additional 25% compared to those of unconstrained high-fixed assets firms.<sup>27</sup>

In sum, the bulk of our evidence suggests that *Ordonnance 2006-346* helped democratize credit access toward existing firms that had been starved of funding for viable projects; in particular, firms located in the rural part of the country, and small, young, and financially constrained firms. These same firms

between Post, Treated, and a dummy variable equal to 1 if a firm comes from one of the treated subsamples of interest and else 0.

 $<sup>^{27}</sup>$  Some estimates in Table V suggest that the operating performance of large, old, and financially unconstrained firms declined after the reform. While the "partial equilibrium effect" we describe is that the reform expanded the menu of pledgeable assets—increasing the demand for debt across the board—a likely "general equilibrium effect" is that it allowed smaller, younger, and previously constrained firms to compete more aggressively with their larger, older, and unconstrained counterparts, cutting into the operating margins of the latter firms.

#### Table V

#### The Effect of the Collateral Reform on Firm Performance: Cross-Subsample Difference-in-Differences Matching Estimations

The first five columns of this table show the results from the model estimation

$$Y_{i,t} = \alpha_i + \alpha_{k,t} + \beta Post_t \times Treated_i + \varepsilon_{i,t},$$

while the final column shows the results from the hazard model estimation

$$\lambda_{i,t} = \phi_t \exp(\beta Treated_i + \gamma Post_t \times Treated_i),$$

where the models are separately estimated on subsamples of firms characterized according to asset size (Panel A), number of employees (Panel B), company age (Panel C), and financial constraints (Panel D), with the fixed effects restricted to be identical across subsamples. Y is *Investment*, Employees, Sales, Profitability, or Profit Volatility. See the caption of Table III for more details about these variables, the hazard rate  $\lambda_{i,t}$ , and our choice of failure year. Post is a dummy equal to 1 starting from 2006 onward, else 0. Treated is a dummy equal to 1 for firms with a 2005 fixed-tototal assets ratio in the top quartile, else 0.  $\alpha_i$  and  $\alpha_{k,t}$  indicate firm and industry-year fixed effects, respectively. The regressions in columns (1) to (5) are run on a propensity score matched sample using 2005 values of size, age, number of employees, profitability, and total leverage as covariates. The estimation in column (6) is run on a within-year-and-industry propensity score matched sample using pre-reform average values of profitability, total leverage, and profit volatility as covariates. Each treated firm is matched with one unique control firm. The subsamples are firms with 2005 total assets in the bottom ("small") or top ("large") quartile; pre-reform number of employees in the bottom ("few") or top ("many") quartile; 2005 company age below ("young") or above ("old") 30 years; and pre-reform financial constraints above ("Constrained") or below ("Unconstrained") a critical value, where we use the SAFE index to measure financial constraints. The table reports each subsample  $\beta$  as well as the cross-subsample difference in  $\beta$  ("Diff."). t-Statistics (in parentheses) are calculated from standard errors clustered at the firm level. \*\*\*, \*\*, and \* indicate significance at the 99%, 95%, and 90% confidence levels, respectively.

	Invest- ment (1)	Employees (2)	Sales (3)	Profitability (4)	Profit Volatility (5)	Hazard Rate (6)
	Par	nel A: Size-Bas	ed Subsamp	le Contrasts		
Small	0.010*** (4.35)	0.106*** (5.09)	0.179*** (7.29)	0.011*** (3.15)	-0.005** $(-2.44)$	-1.786*** (-3.72)
Large	0.001 (0.29)	-0.019 $(-1.00)$	-0.069*** (-3.26)	(	-0.003** $(-2.08)$	-0.896*** (-2.99)
Diff. (small-large)	0.009*** (3.84)	0.125*** (5.07)	0.248*** (8.97)	0.010*** (2.78)	-0.002 $(-0.92)$	-0.890** (-2.06)
	Panel B: Nu	mber of Emplo	yees-Based	Subsample Co	ontrasts	
Few	0.012*** (5.13)	0.237***	0.281*** (10.53)	0.012*** (4.01)	-0.005*** (-3.29)	-1.858*** (-4.05)
Many	0.003 (1.51)	-0.095*** (-6.08)	-0.131*** (-6.61)	$-0.005* \\ (-1.69)$	-0.001 (-0.98)	-0.992*** $(-3.90)$
Diff. (few-many)	0.009*** (3.90)	0.332*** (13.14)	0.412*** $(14.93)$	0.016*** (5.10)	-0.004** (-2.23)	-0.865** (-2.02)

(Continued)

	Panel C	: Company Age	e-Based Subsar	mple Contra	ısts	
Young	0.004***	0.065***	0.072***	0.005**	-0.005***	-1.159***
	(3.26)	(5.26)	(5.10)	(2.49)	(-4.55)	(-3.26)
Old	0.002*	-0.033***	-0.044***	0.001	0.000	-0.906***
	(1.69)	(-2.66)	(-3.00)	(0.60)	(-0.36)	(-2.62)
Diff. (young-old)	0.002	0.098***	0.117***	0.004*	-0.004***	-0.253
	(1.37)	(7.04)	(7.33)	(1.74)	(-4.12)	(-0.89)
	Panel D: Fir	nancial Constra	aints-Based Su	bsample Co	ntrasts	
Constrained	0.009**	0.113***	0.209***	0.013***	* 0.001	-1.999***
	(2.37)	(3.49)	(5.82)	(2.66)	(0.25)	(-4.34)
Unconstrained	0.002	-0.019	-0.084**	0.001	-0.002	-0.901***
	(0.66)	(-0.72)	(-2.56)	(0.16)	(-0.86)	(-3.54)
Diff. (constrained -	- 0.007*	0.132***	0.292***	0.012**	0.003	-1.098***
unconstrained)	(1.75)	(3.58)	(6.82)	(2.15)	(0.90)	(-2.55)

Table V—Continued

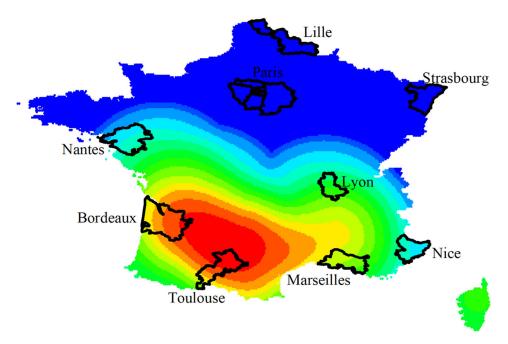
then became able to increase their capital and labor investments, sales, and profitability, and to reduce their overall risk and default rates.

## V. Enlarged Credit Access and Entrepreneurship: How *Ordonnance* 2006-346 Affected Start-Ups

Our analysis so far has focused on the impact of a collateral reform on firms that already existed. The results showed that enlarging the contracting space with the insertion of new categories of recognizable collateral allowed firms that are traditionally constrained to obtain more credit, with measurable positive effects on activities such as investment, employment, and growth. Notably, many of those firms—often young, small, and located in the countryside—contracted debt financing for the first time. These results paint a picture consistent with the idea that  $Ordonnance\ 2006-346$  helped democratize credit access toward firms that had been starved of funding for viable projects. Yet, the prior analysis left out a margin that often simultaneously speaks to the issues of age, size, and financial constraints: the establishment of new firms. In this section, we study the impact of  $Ordonnance\ 2006-346$  on business formation.

Using department-level data on start-ups from INSEE and employment from EUROSTAT, we start off with a spatial analysis of business formation in France around the reform, showing the relevant mapping of firm births. The heat map in Figure 7 highlights those areas in France with a high probability that the change in the ratio of start-up businesses per 1,000 workers from the pre- to the post-reform period exceeds that of the top decile across all departments, which is 4.2.<sup>28</sup> The deeper red (blue) an area's color in the map, the higher (lower) is the probability of observing significantly large occurrences

<sup>&</sup>lt;sup>28</sup> We use department-level data from 2001 to 2008 since INSEE modified its coverage methods in 2009. After aggregating the monthly series of business start-ups in each year, we compute for



**Figure 7.** The effects of the reform on enterprise birth rates. The map depicts the probability with which the department-level median change in the ratio of start-up businesses per 1,000 workers from before to after the reform lies above the top decile across all departments. The deeper red (blue) an area's color in the map, the higher (lower) is the probability. The black-rimmed departments contain cities with more than 1 million inhabitants.

of new business entries in a locality. The black-rimmed departments contain cities with more than 1 million inhabitants.

Figure 7 reveals striking similarities with Figure 5 in Section IV.A, which maps increases in credit access across France. These patterns are confirmed by spatial and panel data econometrics. First, the Moran's Z-score is 2.9, pointing to a significant (at the 1% level) geographical clustering of business formation in the areas highlighted in red. Second, the correlation between the distributions of the kernel estimates of the probability of start-up emergence event (mapped in Figure 7) and the event of long-term leverage change (mapped in Figure 5) is 0.5 (also significant at the 1% level). Panel data tests further show that the departments with red areas in common across the maps in Figures 5 and 7 ("overlapping departments") experienced the most significant positive increase in new business entries.<sup>29</sup>

We next turn to firm-level data from AMADEUS. Our raw start-up data set contains approximately 100,000 observations across a number of industries

each department each year the ratio of start-up businesses per 1,000 workers by dividing the number of start-ups by the number of employed workers (expressed in thousands).

<sup>29</sup> These tests are reported in Table IA.III in the Internet Appendix. Our department-level panel data analysis follows the logic of the state-level analyses in Kerr and Nanda (2009).

Table VI
The Effect of the Collateral Reform on the Leverage of Start-Ups

This table reports the mean leverage ratios of start-ups (Panel A), matched non-start-ups (Panel B), as well as the differences between the mean leverage ratios of start-ups and non-start-ups (Panel C) before and after the collateral reform using only data from the year of incorporation for the start-ups. Using either start-ups or non-start-ups, we separately consider the full sample, the treated subsample ("High-Fixed Assets Firms"), and the control subsample ("Low-Fixed Assets Firms"). Treated start-ups are those with a fixed-to-total assets ratio in the top quartile in their year of incorporation. In Panel A, we match each treated start-up with a unique start-up from the lower fixed-to-total assets quartiles from the same industry, incorporated in the same year, and located in the same French department. Analogously, in Panel B we match each treated (control) start-up on a unique treated (control) non-start-up from the same industry, in the same year, and located in the same French department. The table reports means over the pre-reform period (2001 to 2005), the post-reform period (2006 to 2009), and the difference between the two periods. The final column displays the differences across treated and control firms. t-Statistics are given in parentheses. \*\*\*, \*\*, and \* indicate significance at the 99%, 95%, and 90% confidence levels, respectively.

	Full Sample (1)	High-Fixed Assets Firms (2)	Low-Fixed Assets Firms (3)	Diff. High–Low (2)–(3)
	Panel	A: Start-Ups		
Pre-reform period (1)	0.225	0.317	0.133	0.184***
Post-reform period (2)	0.318	0.448	0.189	0.259***
Difference (2)–(1)	0.093***	0.131***	0.055***	0.075***
, , , ,	(26.62)	(25.49)	(13.95)	(11.62)
	Panel B: Ma	tched Non-Start-Up	os	
Pre-reform period (3)	0.115	0.147	0.082	0.066***
Post-reform period (4)	0.147	0.201	0.092	0.108***
Difference (4)–(3)	0.032***	0.053***	0.011***	0.043***
	(15.79)	(16.78)	(4.62)	(11.02)
Panel	C: Difference betwe	een Start-Ups and N	Non-Start-Ups	
Difference-in-differences	0.061***	0.077***	0.045***	0.033***
[(2)–(1)]–[(4)–(3)]	(15.24)	(12.87)	(9.99)	(4.23)

over the 2001 to 2009 period. We are left with 35,660 observations after assigning start-ups to "treatment" and "control" groups according to whether they are in the top quartile of the distribution of fixed assets usage. In this analysis, we match treated and control start-ups at a very granular level. Specifically, we ensure that they are both in the same industry, incorporated in the same year, and located in the same French department. Table VI looks at the change in leverage ratios from before to after the reform. Panel A shows that "at-inception" leverage ratios of start-up businesses operating more fixed assets increased significantly more around the collateral reform than the leverage ratios of industry-year-location-matched start-ups operating less fixed assets. The leverage ratios of the treated start-ups increased by more than 13 percentage points, whereas

the leverage ratios of the control start-ups increased only by 5.5 points; an overall positive and significant difference of 7.5 points (*t*-statistic of 11.62).

The following two panels in Table VI contain an extension of our baseline test that speaks to the question of whether the reform was pronouncedly beneficial for start-ups in France. In particular, we further compare changes in start-up leverage around the reform against changes in the leverage of "matched pre-existing firms" operating in the same industry, observed in the same year, and located in the same department. With standard controls included, this triple-differences strategy allows us to assess whether the gains to credit access that are observed by start-ups surpassed those of their pre-existing "comparables" in the economy. Panel B shows that while the treated start-ups observed a 7.5 percentage point increase in their leverage relative to the control start-ups from before to after the reform, the treated matched pre-existing firms observed an increase of only 4.3 points relative to the matched pre-existing control firms. Panel C shows that the difference in the reform-induced leverage effects between start-ups and matched pre-existing firms is 3.3 points, which is both economically and statistically significant.

Digging deeper into post-reform outcomes for start-ups, we next assess the reform's impact on metrics that speak to the issues of business formation, growth, and survival. To guide our work, we look at the recent literature on start-ups. Robb and Robinson (2014) describe the capital structure of newly formed firms in the United States. The authors report that those firms rely heavily on formal (outside) debt financing: business bank loans, business credit lines, and ownerbacked bank loans. Critically, they find that having a capital structure that is tilted toward formal credit channels leads to a greater likelihood of business success (the outside debt ratio has a positive effect on metrics such as operating performance and size). Kerr and Nanda (2009) report a positive impact of bank branch deregulation on entrepreneurship rates in the United States. Their results show that while deregulation reduced the number of small banks, it increased the number of branches across states, ultimately increasing access to bank credit. Interestingly, these authors report an increase in closure rates of newly incorporated companies following deregulation: very small start-ups tended to fail within three years. In subsequent work, Kerr and Nanda (2010) show that bank deregulation also had an impact on start-up entry size.

In Table VII, we report results from additional start-up tests adopting the matching-differences estimation approach used in prior sections to facilitate comparison. Panel A suggests that after the collateral reform, start-ups operating more fixed assets were born (geographically) farther away from France's larger cities. Specifically, the original establishments of start-ups operating more fixed assets observe an 11% increase in their distance to the closest of the five largest French cities (Paris, Lyon, Marseilles, Toulouse, and Lille), with that distance increasing from an average of 55 to 61 km. The birth location of matched start-ups operating less fixed assets, in contrast, seems unaffected by the reform. To put these numbers into context, we note that ample evidence from the banking literature stresses that increases in

Table VII

The Effect of the Collateral Reform on Start-Up Emergence,
Growth, and Survival

This table reports mean distance to the closest top five cities (Panel A), mean size (Panel B), mean asset growth (Panel C), proportion of exits (Panel D), and proportion of bankruptcies (Panel E) for start-ups before and after the reform. DistanceTop5Cities is the log distance to the closest of the five largest French cities in kilometers, and Size is the log of total assets, both measured in the year of incorporation. Asset Growth is log growth in fixed assets from the year of incorporation to one year later. General Exits (Bankruptcies) is the fraction of start-ups incorporated in the pre-reform or post-reform period that have disappeared from our sample (gone bankrupt) by the end of the corresponding period. We define a bankruptcy as a start-up whose status is equal to "default of payment," "insolvency proceedings," "receivership," "bankruptcy," "dissolved," and "in liquidation." The table considers the full sample, the treated subsample ("High-Fixed Assets Firms"), and the control subsample ("Low-Fixed Assets Firms") separately. Treated start-ups are those with a fixedto-total assets ratio in the top quartile in their year of incorporation. In Panel A, we match each treated start-up with a unique start-up from the lower fixed-to-total assets quartiles by choosing a start-up from the same industry and incorporated in the same year. In Panel B, we follow a similar strategy, but match within industry, year of incorporation, and French department. In Panels C through E, we run our tests on a propensity score matched sample, using size, number of employees, profitability, and total leverage in the year of incorporation as covariates and matching within year and French department. The table reports statistics over the pre-reform period (2001 to 2005), the post-reform period (2006 to 2009), and the difference between the periods. The final column shows the differences across treated and control firms. t-Statistics are given in parentheses. \*\*\*, \*\*, and \* indicate significance at the 99%, 95%, and 90% confidence levels, respectively.

	Full Sample (1)	High-Fixed Assets Firms (2)	Low-Fixed Assets Firms (3)	Diff. High–Low (2)–(3)
	Panel A: Dis	tance to Top Five Cit	ies	
Pre-reform period (1) Post-reform period (2)	4.044 4.085	4.003 4.098	4.086 4.071	-0.083*** 0.026
Difference (2)–(1)	0.041** (2.48)	0.095*** $(4.01)$	$-0.015 \\ (-0.55)$	0.109*** (3.24)
	P	Panel B: Size		
Pre-reform period (1) Post-reform period (2)	4.601 4.744	4.952 5.217	4.250 4.271	0.702*** 0.946***
Difference (2)–(1)	0.143*** (8.84)	0.265*** $(12.07)$	0.021 (1.00)	0.244*** (7.87)
	Panel	C: Asset Growth		
Pre-reform period (1) Post-reform period (2)	0.118 0.139	0.033 0.096	0.208 0.187	$-0.175*** \\ -0.091***$
Difference (2)–(1)	0.021 $(1.46)$	0.063*** (5.00)	-0.022 $(-0.82)$	0.085*** (2.89)
	Panel	D: General Exits		
Pre-reform period (1) Post-reform period (2)	0.310 0.307	0.309 0.276	0.312 0.338	-0.003 -0.062***
Difference (2)–(1)	$-0.004 \\ (-0.46)$	-0.033*** $(-2.85)$	0.026** (2.13)	-0.059*** (-3.52)
	Panel	E: Bankruptcies		
Pre-reform period (1) Post-reform period (2)	0.027 0.026	0.023 0.013	0.031 0.039	-0.008* -0.026***
Difference (2)–(1)	$-0.001 \\ (-0.28)$	-0.010*** (-2.84)	0.008* (1.73)	-0.018*** (-3.07)

bank-firm distances as small as 1 km are associated with a higher likelihood of loan applications being rejected (see Agarwal and Hauswald (2010)).<sup>30</sup>

Panel B reports results on firm size at birth. The size of start-ups operating more fixed assets increased significantly with the reform (from US\$99,000 to US\$115,000, on average). In contrast, the size of industry-year-location-matched start-ups operating fewer fixed assets did not change materially. Panel C looks at firm growth, as measured by fixed asset growth over the first year following incorporation. The estimates suggest that high-fixed assets start-ups grew faster after the reform, while the growth rate of matched low-fixed assets start-ups declined. In particular, while start-ups operating more fixed assets observed an increase in their asset growth of 6.3 percentage points, start-ups operating fewer fixed assets observed a decline of 2.2 points.<sup>31</sup>

Finally, Panels D and E report results on a key metric of entrepreneurial success, namely, survival rates. Panel D reports the probability that a start-up born in the pre-reform or the post-reform period exited the sample by the end of the period. Analogously, Panel E reports the probability that a start-up formally filed for bankruptcy by the end of the relevant period. The two panels do so separately for high- and low-fixed assets start-ups matched on various at-inception characteristics. While the general exit (formal bankruptcy) probability of high-fixed assets start-ups declined by about 3.3 (1.0) percentage points from the pre- to the post-reform period, the general exit (formal bankruptcy) probability of their matched low-fixed assets start-ups increased by about 2.6 (0.8) points. The relevant difference-tests statistics are significant, but the economics of the results we show are particularly interesting in pointing out that while the levels of general exit and bankruptcy rates were indistinguishable across high- and low-fixed assets start-ups before the reform, they became markedly lower for high-fixed assets start-ups after *Ordonnance* 2006-346.<sup>32</sup>

The evidence of this section is novel in showing that a reform that allows parties to contract on a larger collateral menu may have important implications for business formation, growth, and survival. Notably, the evidence suggests that the democratization of the collateral regime may lead not only to an increase in the entry of business ventures in the economy, but also to an increase in the entry of what appear to be "better" entrepreneurs—entrepreneurs that are better able to grow their nascent businesses and survive longer. Coming

<sup>&</sup>lt;sup>30</sup> The literature suggests that the geographic distance between a firm and a financial service provider is negatively related to credit access (see, e.g., Brevoort and Hannah (2006), Bellucci, Borisov, and Zazzaro (2013), Lee and Brown (2017)). Looking at Italian small and medium companies (SMEs), Bellucci, Borisov, and Zazzaro (2013) estimate that a 7-km increase in the distance between a firm and a branch of its main bank increases the likelihood of significantly tighter credit terms (including credit availability).

 $<sup>^{31}</sup>$  To avoid confounding effects arising from the global financial crisis, we run the asset growth tests in Table VII on the shorter sample period from 2003 to 2007. However, when we run these tests on our full sample from 2001 to 2009, we continue to find a significantly positive DID coefficient.

 $<sup>^{32}</sup>$  Given the sophisticated matching used in the survival analysis in Table VII, and the fact that failure is a low probability event (e.g., less than 2% of start-ups file for bankruptcy in each year), in that analysis we define treated firms as firms with an above-median fixed assets ratio so as to not lose too many observations.

from a different perspective and setting, our results echo Robb and Robinson's (2014, p. 153) argument that "The reliance on external debt underscores the importance of credit markets for the success of nascent business activity." Allowing start-ups to tap external debt markets appears to be an important feature of credit reforms that aim to boost business formation and growth.

#### VI. Capital Allocation Efficiency

Our evidence above suggests that *Ordonnance 2006-346* made creditors more willing to lend to small, young, and rural firms, usually disadvantaged in credit markets. A broader question is whether the reform led to a more efficient allocation of capital in the French economy. We use two approaches to tackle this issue.

First, we follow Wurgler's (2000) argument that an efficient capital allocation process implies that corporate investment increases in sectors with better growth opportunities and decreases in sectors with poorer opportunities. Using industry value-added as proxy for growth opportunities, we estimate the elasticity of investment to value-added to gauge capital allocation efficiency. In our base test, we study how the overall sensitivity changes from the pre-reform to the post-reform period by running the following regression on industry-level data

$$InvestmentGrowth_{s,t} = \alpha + \beta ValueAddedGrowth_{s,t} + \varepsilon_{s,t}, \tag{8}$$

where  $InvestmentGrowth_{s,t}$  is the percentage change in an industry's gross fixed capital formation from year t-1 to year t.  $ValueAddedGrowth_{s,t}$  is the percentage change in value-added over the same period. We next study whether the reform had a differential effect on the elasticity of investment to value-added across industries treated by the reform (industries with high-fixed assets utilization) and those not treated by the reform (industries with low-fixed assets utilization). To do so, we run the regression

InvestmentGrowth<sub>s,t</sub> = 
$$\alpha + \beta V$$
 alueAddedGrowth<sub>s,t</sub> +  $\gamma T$ reated<sub>s</sub>  
+  $\delta V$  alueAddedGrowth<sub>s,t</sub> ×  $T$ reated<sub>s</sub> +  $\varepsilon_{s,t}$ , (9)

where  $Treated_s$  is a dummy variable equal to 1 if the 2005 fixed assets ratio of industry s is in the top quartile of the fixed assets ratio distribution of all industries, else 0.

Table VIII suggests that the sensitivity of investment to value-added in France jumps from 0.48 before the reform (column (1)) to 0.85 after the reform (column (2)), with the difference of 0.36 being highly significant. More interestingly, the results in columns (3) and (4) suggest that the increase in sensitivity is driven almost exclusively by the reform-treated industries. We build on Wurgler (2000) to provide economic intuition for our estimates. Consider a shock causing value-added growth to increase by 10% (e.g., a technology shock that improves the production process in an industry). Column (3) suggests that, before the reform, investment would increase in response to the shock by

## Table VIII Cross-Industry Investment Allocation Efficiency Tests

Following Wurgler (2000), the first three columns of this table report the results from the paneldata regression

 $InvestmentGrowth_{s,t} = \alpha + \beta ValueAddedGrowth_{s,t} + \varepsilon_{s,t},$ 

while the final three columns report the results from the regression

 $InvestmentGrowth_{s,t} = \alpha + \beta ValueAddedGrowth_{s,t} + \gamma Treated_s \\ + \delta ValueAddedGrowth_{s,t} \times Treated_s + \varepsilon_{s,t}$ 

where InvestmentGrowth is the percentage change in gross fixed capital formation in industry s from year t-1 to year t, ValueAddedGrowth is the percentage change in value-added in industry s from year t-1 to year t, and Treated is a dummy equal to 1 if the sector-level fixed assets ratio in 2005 is in the top quartile of the fixed assets ratio distribution of all ISIC industries, else 0. We estimate the regressions separately using pre- and post-reform data. The table also reports the differences in estimates across the pre- and post-reform periods (Diff.). t-Statistics (in parentheses) are calculated from robust standard errors. \*\*\*, \*\*, and \* indicate significance at the 99%, 95%, and 90% confidence levels, respectively.

	Sample Period							
	Pre-Reform (1)	Post-Reform (2)	Diff. (2)–(1)	Pre-Reform (3)	Post-Reform (4)	Diff. (4)–(3)		
$\overline{Value Added Growth}$	0.481***	0.845***	0.364**	0.509***	0.598***	0.088		
	(4.87)	(6.20)	(2.16)	(3.59)	(2.26)	(0.30)		
Treated				-0.012	-0.055	-0.043		
				(-0.47)	(-1.70)	(-1.05)		
Value Added Growth  imes				-0.057	0.964**	1.020***		
Treated				(-0.21)	(2.94)	(2.42)		
Adjusted- $R^2$	0.06	0.16		0.07	0.17			
Observations	517	217		349	144			

about 4.5% in industries treated by the reform and by about 5% in industries not treated by the reform. The difference between these two effects is not significant. In contrast, the estimates in column (4) suggest that, after the reform, investment would increase by about 15.5% (a three-fold increase) in treated industries, but by only 6% in nontreated industries. The difference in the elasticity of investment to value-added across treated and nontreated industries is thus significant in both economic and statistical terms.

Our second proxy for capital allocation efficiency is the external financial dependence measure of Rajan and Zingales (1998). This measure captures an industry's technology-driven demand for external financing. In an efficient economic system, capital should be directed toward those sectors that need more external funding. If the reform relaxed credit constraints, one should observe significantly larger increases in borrowing among firms operating in sectors highly dependent on external financing. To test this hypothesis, we split our sample into two groups, one including sectors with a high dependence on external financing (above median) and one including sectors with a low dependence

(below median). Next, within each subsample we split the firms into "treated" and "control" firms, where treatment status is assigned to firms with a fixed assets-to-total assets ratio within the top quartile in 2005. Control status is assigned to PS matched firms. In further analyses, we rerun the same tests on subsamples of firms separated according to their asset size, number of employees, age, and financial constraints, similarly to what we do in Section IV.C.

Table IX suggests that treated firms with high dependence on external financing observed greater reform-induced increases in their long-term leverage than other firms. In particular, Panel A reports that the increase in long-term leverage following the reform is larger for the highly dependent firms with high-fixed assets intensity, 7.9 percentage points. In contrast, weakly dependent firms with high-fixed assets intensity observe a lower average increase in long-term leverage of 5.1 percentage points.

Notably, when we contrast the increases in long-term leverage of highly dependent high-fixed assets firms across different subsamples, we find that they are economically larger among firms with smaller asset size, firms with fewer workers, younger firms, and firms with more financial constraints (see Panels B to I). For example, column (1) of Panel B shows that the mean long-term leverage of small highly dependent high-fixed assets firms increased after the reform by 10 percentage points, while for their large counterparts the increase was about 5.8 points (see Panel C, column (1)). Similar figures are attached to the differences across samples of firms classified as financially constrained versus firms that do not fall into that classification.

Taken together, our results suggest that *Ordonnance 2006-346* helped the French economy to allocate more capital to high value-added sectors as well as sectors that require more external financing. These findings are consistent with the idea that the collateral reform produced positive welfare gains by reducing allocation credit distortions.

#### VII. Robustness

In this section, we offer results of several robustness tests. Section VII.A starts with parallel trends tests. Section VII.B repeats our main debt financing regressions on placebo countries. Section VII.C examines whether our finding that rural firms benefitted more from the collateral reform than urban firms is attributable to a tendency of rural firms to be smaller or to have a higher fixed-assets intensity than urban firms. In Table IA.VIII in the Internet Appendix, we further offer the results from repeating our main regressions on collapsed data and on public French firms.

#### A. Parallel Trends

The validity of DID tests rests on several assumptions, one of which is referred to as the "parallel trends" assumption. To ensure that our tests yield valid results, it is important to show that treated and control firms display conformable trends in outcome variables before the reform. We have already

#### Table IX

#### The Effect of the Collateral Reform on the Leverage of Firms with High and Low External Financial Dependence

This table shows the mean long-term leverage ratio for firms with high or low external financial dependence. Firms are further classified based on whether they have high- ("treated") or low-("controls") fixed assets intensity. The tests are run on all firms (Panel A), firms with 2005 total assets in the bottom ("small," Panel B) or top ("large," Panel C) quartile, firms with pre-reform number of employees in the bottom ("few," Panel D) or top ("many," Panel E) quartile, 2005 company age below ("young," Panel F) or above ("old," Panel G) 30 years, and pre-reform financial constraints above ("constrained," Panel H) or below ("unconstrained," Panel I) a critical value, where we use the SAFE index to measure financial constraints. Long-term Leverage is long-term debt scaled by assets. We proxy for external financial dependence by calculating the median proportion of capital expenditure not financed by cash flows from operations for U.S. public firms over the 1975 to 2005 period, classifying firms in industries with an above (below) median value as high (low) dependence firms. We classify as high- (low-) fixed assets firms those with a 2005 fixed-to-total assets ratio above (below) the third quartile. The table reports averages over the pre-reform period (2001 to 2005), the post-reform period (2006 to 2009), and their differences. The final two columns show the difference in means between high and low external financial dependence firms separately for treated and control firms. All estimations are run on a propensity score matched sample using 2005 values of size, age, number of employees, profitability, and total leverage as covariates. Each treated firm is matched with one unique control firm. \*\*\*, \*\*, and \* indicate statistical significance at the 99%, 95%, and 90% confidence levels, respectively.

	External Financial Dependence			Diff. High–Low		
	High De <sub>l</sub>	pendence	Low Dependence		Dependence	
	Treated (1)	Control (2)	Treated (3)	Control (4)	Treated (1)–(3)	Control (2)–(4)
		Panel A	A: All			
Mean 2001 to 2005 (1)	0.019	0.014	0.021	0.015		
Mean 2006 to 2009 (2)	0.099	0.046	0.072	0.039		
Diff. (2)–(1)	0.079***	0.032***	0.051***	0.025***	0.028***	0.007***
		Panel B	: Small			
Mean 2001 to 2005 (1)	0.023	0.011	0.016	0.015		
Mean 2006 to 2009 (2)	0.124	0.053	0.074	0.040		
Diff. (2)–(1)	0.100***	0.042***	0.059***	0.025***	0.042***	0.017***
		Panel C:	: Large			
Mean 2001 to 2005 (1)	0.018	0.014	0.023	0.015		
Mean 2006 to 2009 (2)	0.076	0.040	0.070	0.036		
Diff. (2)–(1)	0.058***	0.026***	0.047***	0.022***	0.010***	0.004
		Panel I	): Few			
Mean 2001 to 2005 (1)	0.022	0.013	0.018	0.013		
Mean 2006 to 2009 (2)	0.110	0.045	0.073	0.044		
Diff. (2)–(1)	0.088***	0.031***	0.056***	0.032***	0.032***	0.000

(Continued)

Table IX—Continued

		Panel E:	Many			
Mean 2001 to 2005 (1)	0.017	0.014	0.023	0.016		
Mean 2006 to 2009 (2)	0.069	0.040	0.068	0.039		
Diff. (2)–(1)	0.052***	0.026***	0.045***	0.023***	0.007**	0.003
		Panel F:	Young			
Mean 2001 to 2005 (1)	0.017	0.015	0.022	0.014		
Mean 2006 to 2009 (2)	0.104	0.047	0.072	0.041		
Diff. (2)–(1)	0.086***	0.032***	0.050***	0.027***	0.036***	0.005**
		Panel (	<del>ያ</del> : Old			
Mean 2001 to 2005 (1)	0.022	0.013	0.021	0.013		
Mean 2006 to 2009 (2)	0.083	0.043	0.069	0.045		
Diff. (2)–(1)	0.061***	0.030***	0.048***	0.032***	0.013***	-0.002
		Panel H: Co	nstrained			
Mean 2001 to 2005 (1)	0.020	0.017	0.023	0.024		
Mean 2006 to 2009 (2)	0.120	0.059	0.089	0.044		
Diff. (2)–(1)	0.100***	0.042***	0.065***	0.021***	0.035***	0.021***
		Panel I: Unc	onstrained			
Mean 2001 to 2005 (1)	0.013	0.014	0.015	0.008		
Mean 2006 to 2009 (2)	0.074	0.032	0.058	0.027		
Diff. (2)–(1)	0.061***	0.019***	0.043***	0.019***	0.018***	0.000

offered some informal evidence suggesting that this is the case in Figures 2 and 3, which show that neither high- nor low-fixed assets firms observe significant trends in total, long-term, and short-term leverage over the pre-reform period. We offer more formal evidence in Table X, which shows the changes in our leverage and real effects outcome variables over the pre-reform period separately for treated and control firms. The table confirms that the changes in no single variable are significantly different across the two groups of firms. <sup>33</sup>

#### B. Other Civil Law Countries

One potential concern with our results is that changes common to Western European countries in 2006—and not *Ordonnance 2006-346*—could explain the growth in long-term debt-taking by high-fixed assets firms in France. As a falsification test, we repeat our analysis using data from European civil law

 $<sup>^{33}</sup>$  In Table IA.VII in the Internet Appendix, we demonstrate that using subsamples based on size, number of employees, company age, and financial constraints also does not violate the parallel trends assumption.

## Table X Parallel Trends Tests

This table shows the changes in our outcome variables over the pre-reform period (2001 to 2005) for high-("treated") and low-("control") fixed assets firms plus the differences in the changes across the two types of firms ("difference"). We classify as high-(low-) fixed assets firms those with a 2005 fixed-to-total assets ratio above (below) the third quartile. Long-Term Leverage is long-term debt scaled by total assets. Proportion Zero-Leverage Firms is a dummy variable equal to 1 for firms with no long-term leverage, else 0. Investment is the sum of the annual change in fixed capital plus the change in inventories, scaled by total assets. Employees is the log of the number of employees. Sales is the log of sales. Profitability is earnings before interest and taxes scaled by assets. Profit Volatility is the standard deviation of profitability over the most recent four fiscal years. The parallel trends tests exclude firms that do not have complete data over the entire sample period. Also, they are run on a propensity score matched sample using 2005 values of size, age, number of employees, profitability, and total leverage as covariates. Each treated firm is matched with one unique control firm.

Pre-Reform Period Change in	Treated	Control	Difference Treated Minus Control	Difference p-Value
Long-term Leverage	0.002	0.002	0.000	[0.88]
Proportion Zero-Leverage firms	0.004	0.001	0.003	[0.73]
Investment	0.022	0.019	0.003	[0.50]
Employees	-0.658	-0.657	-0.001	[0.98]
Sales	-0.502	-0.448	-0.054	[0.30]
Profitability	-0.101	-0.097	-0.004	[0.37]
Profit volatility	-0.047	-0.047	-0.001	[0.70]

countries that had already reformed their security laws at the start of our sample period: Belgium (a neighbor with close economic ties), Italy, Portugal, and Spain. Figure 8 offers graphical evidence that none of these countries displayed debt-taking behaviors similar to those found in France around 2006. Regression-based evidence that points to the same conclusion is offered in Table IA.IX in the Internet Appendix.

#### C. Underlying Industry and Size Spatial Distribution

One observation about our inferences regarding the geography of the effects of *Ordonnance 2006-346* is that it could reflect the underlying distribution of industrial activity in France, or a higher concentration of smaller companies in rural areas. To examine these potential dynamics, we construct two heat maps, one representing the intensity of hard assets usage across France before the reform, and the other tracing the distribution of firm size across the country in that same period.<sup>34</sup> These maps are presented in Figure 9. We conjecture that

<sup>&</sup>lt;sup>34</sup> Following Campello and Larrain (2016), we identify and map heavy-asset industry intensity as follows. First, using Compustat data over the 1985 to 2005 period, we compute the firm-level time-average ratio of PP&E to total assets ("fixed-to-total asset ratio"). Next, we divide the sample into the seven industry groups with SIC codes that have an international counterpart: (1)

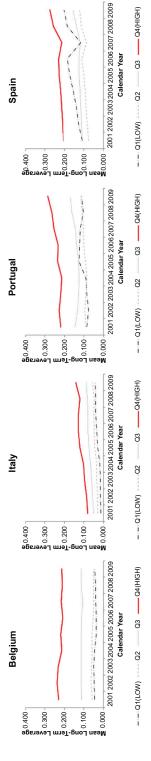


Figure 8. Evolution of mean long-term leverage in the placebo countries. The figure shows the evolution of mean long-term leverage for each placebo country and fixed assets quartile (Q) over the 2001 to 2009 period. The placebo countries are Belgium, Italy, Portugal, and Spain. Q1, Q2, Q3, and Q4 indicate the first, second, third, and fourth fixed assets quartile, respectively. (Color figure can be viewed at wileyonlinelibrary.com)

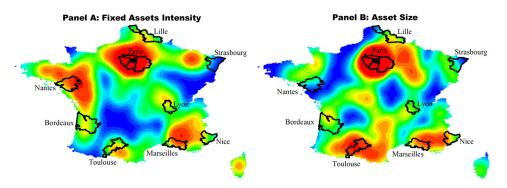


Figure 9. Pre-reform fixed assets intensity and asset size distributions. The maps depict the probability that the fraction of firms operating in the three industries that rely most heavily on fixed assets exceeds the median across departments (Panel A), and the probability that the fraction of small firms exceeds the median across departments (Panel B) in 2005. The deeper red (blue) an area's color in the maps, the higher (lower) is the probability of being above the median. The black-rimmed departments contain cities with more than 1 million inhabitants.

if our central results are driven by the underlying industry-mix or firm-size distributions, we would expect to see these heat maps displaying red areas concentrated in the rural parts of the country and blue areas in the main urban departments. We should also observe a high degree of color-code overlap between these maps and the credit maps in Figure 5. We find no such patterns. To substantiate this inference, we conduct a series of spatial correlation analyses between the relevant sets of maps. The degree of overlap between the map in Panel A (B) of Figure 9 and the map in Panel A of Figure 5, for example, is close to zero (zero) in the deeper red areas and 8% (1%) in the deeper blue areas. Indeed, the correlation between the two probability distributions is equal to -0.4 (-0.1), with a p-value of less than 1%. The heat maps suggest that firms in different parts of the country may use more fixed assets in their production process, and may also be small. However, there is no evidence to suggest that firms in/close to bigger cities use less fixed assets or are mostly large firms.

#### VIII. Concluding Remarks

In this paper, we examine France's *Ordonnance 2006-346* to assess how reforms that ease credit access by enlarging collateral menus change the depth and demographics of corporate debt utilization. We show that the reform

0100–0999 Agriculture, Forestry and Fishing; (2) 1000–1499 Mining; (3) 1500–1799 Construction; (4) 2000–3999 Manufacturing; (5) 4000–4999 Transportation and Communications; (6) 5000–5199 Wholesale Trade; and (7) 5200–5999 Retail Trade. For each industrial group, we identify the representative fixed-to-total asset ratio as that of the median firm operating in the industry. Finally, we rank the industries based on the industry-median values of the fixed-to-total asset ratio. To map firms based on size, we define a firm as "small" if its number of employees over the 2001 to 2005 period is in the bottom 5% of the distribution.

significantly increased the debt-taking of French firms with no access to public security markets along both the intensive and the extensive margins, with positive repercussions on fixed capital investment, employment, sales growth, and profitability. We also document significant declines in profit volatility and, ultimately, a lower probability of filling for bankruptcy after the reform. More importantly, we find that the reform-led access reached firms previously rationed in the credit market. We find that the reform particularly benefitted firms that are small, young, or financially constrained, and generally located in rural parts of the country (far from financial centers). We also show novel evidence that a reform that improved the efficiency of the collateral regime had important implications for business formation, growth, and survival, suggesting that the democratization of the collateral regime may lead not only to an increase in the entry of business ventures in the economy, but also to an increase in the entry of promising new entrepreneurs.

The derogation of the anachronic Napoleonic security code led to far reaching changes in the makeup of investment and growth in the French economy. It prompted an increase in the elasticity between investment and value-added, especially in those industries most affected by the reform. It also allowed for more borrowing by firms operating in industries heavily reliant on external financing. All combined, our results point to a significant improvement in capital allocation efficiency in the economy. This is an important effect from a policy-making perspective as reforms of this nature may require fewer resources to implement and maintain than reforms that focus, for example, on law enforcement and judicial intervention.

Initial submission: May 15, 2017; Accepted: February 12, 2019 Editors: Stefan Nagel, Philip Bond, Amit Seru, and Wei Xiong

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**Appendix S1**: Internet Appendix. **Replication Code.**