# **Building a Customer Base under Liquidity Constraints\***

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#### **Abstract**

Do liquidity constraints limit the formation of a customer base? This paper uses a unique data set covering the universe of intra-EU trade relationships of French firms to test this hypothesis. We identify the causal effect of liquidity constraints by relying on a reform that set a limit to the number of days in which French firms could contractually pay each other. We show that the reform reduced working capital needs with French customers, unlocking cash to initiate new international trade relationships. Our results indicate that being paid 3 days earlier in the domestic market raises export growth by 1.2 percentage points. Export growth is achieved by expanding the set of customers, not by increasing sales with existing customers. Firms do not seem to attract new customers by charging lower prices. Instead, our results suggest that product market frictions represent the main obstacle to the accumulation of customer capital.

JEL codes: *F14*, *G31*.

Key words: *liquidity constraints, customer capital, trade credit, IV estimation.* 

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# 1 Introduction

Why do some firms attract more customers than others? The ability of a firm to build and to maintain a demand for its products (or "customer capital") is a key driver of its size, survival, and long-term profitability. Yet, surprisingly little research has been devoted to identifying the firm-level determinants of customer capital. This paper attempts to fill this void by exploring the role of liquidity constraints in the formation of a network of customers.

There are two main channels through which firms invest in customer capital. First, firms devote considerable marketing resources to developing and securing a customer base. US firms spend about as much in advertising as they do in R&D, with estimates of total marketing expenditures ranging from 2 to 8% percent of GDP (Arkolakis, 2010). Second, firms may offer price discounts to attract new customers and retain existing ones. In both cases, firms give up a fraction of present cash-flows to invest in future trade relationships. Liquidity-constrained firms are likely to put more value to immediate cash-flows and therefore to invest less in customer capital (Chevalier and Scharfstein, 1996).

Using a unique customer-supplier data set, we show in a quasi-experimental setting that liquidity constraints limit firm growth on the *demand* side. Specifically, our results indicate that in response to a positive liquidity shock, firms increase sales by expanding their customer base. By contrast, the effect on sales with existing customers is not significant. Looking at the economic mechanism, we find that firms do not appear to charge lower prices following the liquidity shock. Instead, the expansion of the customer base is more pronounced when product market frictions (search costs, switching costs) are high. These findings suggest that (i) liquidity-constrained firms under-invest in customer capital and (ii) for liquidity-constrained firms, overcoming product market frictions is the main obstacle to the expansion of firms' customer bases.

We develop a stylized model to rationalize the link between liquidity constraints and product market frictions. Firms incur marketing costs to build their demand. Marketing serves two purposes: acquiring and retaining customers. When product markets are more frictional, switching suppliers is more costly for customers, and customer acquisition becomes relatively more important for suppliers. Unlike retention costs, acquisition costs have however to be paid

before any transaction takes place. We introduce liquidity constraints by assuming that only an exogenous fraction of future sales can be pledged to finance customer acquisition costs. Our model predicts that the effects of the policy will be larger in frictional product markets as access to liquidity is more important when customers are more difficult to reach.

Our identification relies on an exogenous liquidity shock generated by the enactment of a 2009 French law (the "policy"). The policy introduced a cap on the payment terms authorized in transactions contracted under the French trade code. Specifically, firms were required to pay their suppliers within 60 days, otherwise they would be exposed to important legal sanctions. This resulted in a large decrease in payment periods for firms operating in France. By contrast, international transactions were not directly affected by the policy. Importantly, for financially constrained firms, this large variation in payment terms acted as a positive liquidity shock. Consistently with Barrot (2016), we document how firms more exposed to the policy ex ante exhibit lower working capital needs and higher cash ratios after its enactment.

We isolate the role of the liquidity shock by focusing on the effects of the policy on international transactions which were not affected by the 60-days cap. Our core object of study is therefore the effect of lower domestic payment periods on the accumulation of international customer capital. The focus on exports is actually a natural starting point for our research question as liquidity constraints are more likely to be binding in the context of international trade. We rely on an extensive data set recording the quasi-universe of product-level transactions between French exporters and their EU-based customers to keep track of international customer capital.

Our identification strategy is based on the observation that firms that were paid in 90 days before the policy change were more likely to be affected than firms that were already paid in less than 60 days. The distance to the sixty-days threshold, however, is likely to be correlated with unobservable variables (suppliers' bargaining power, for instance). We address this issue by designing a "shift-share" variable (Bartik, 1991) based on the heterogeneity of sectoral payment terms. This "shift-share" variable serves as an instrument of the variation of payment periods.

<sup>&</sup>lt;sup>1</sup>Indeed, the restriction of trade credit contracts could affect the ability of suppliers to initiate and maintain trade relationships (Breza and Liberman, 2017).

<sup>&</sup>lt;sup>2</sup>Liquidity constraints can be particularly severe when selling to foreign customers because of longer payment terms and higher search frictions related to geographical and cultural distances (Feenstra, Li and Yu, 2014; Schmidt-Eisenlohr, 2013; Rauch, 1999; Eaton et al., 2014).

Our estimations therefore compare customer capital dynamics between firms present in sectors with high payment periods before the reform to firms in sectors with low payment periods. Moreover, we exploit the granularity of our data set by introducing both country-year and firm fixed effects. The estimates are therefore insensitive to country-level shocks and firms' selection into specific destinations during the 2008 trade collapse as they are based on the comparison between firms that are differentially affected by the policy in a given market (Paravisini et al., 2014; Eaton et al., 2016).

Our baseline specification indicates that being paid three days earlier by domestic customers (the sample standard deviation) raises the export growth rate by 1.2 percentage points. Strikingly, the vast majority of the effect is explained by an expansion of the firms' customer base. Two thirds of the expansion of the customer base comes from the acquisition of new customers, the remaining part being driven by a higher customer retention. We find the positive liquidity shock increased the entry into new destinations and limited the exit rate, which indicates that the effects on the accumulation of customer capital also had implications for firms' presence in export markets.

Digging further into the mechanism, we first test whether firms expand their set of customers by charging lower prices. We find no impact of the decrease in payment periods on prices (as measured by unit values), even when looking separately for new and existing customers. We then investigate the role of product market frictions using two different proxies. First, we rely on the product classification established by Rauch (1999) which indicates whether products are traded on organized exchanges. The absence of a centralized platform indicates that suppliers have to enter a costly search process to find customers. Second, we use the product-level measure of the average duration of trade relationships introduced by Martin, Mejean and Parenti (2018). Long relationship durations signal that customers find it costly to identify and to change suppliers. In both cases, we find that the effects on customer capital are only significant when product market frictions are high. Overall, these results imply that liquidity frictions dampen the accumulation of customer capital by limiting firms' ability to identify new customers or to attract them through non-price actions (*e.g.*, advertising or product improvements).

It could be objected that, since firms are clients as well as suppliers, the net effect of the

policy might be null or ambiguous. We address this issue by computing the rate of payment collection in *net* terms. As both payment periods from customers and to suppliers are expected to converge towards sixty days, the policy tends to mechanically reduce the difference between the two. We find our main results to be qualitatively unchanged by this alternative measure of payment periods.

There might be an alternative explanation to our results. By capping payment terms between French firms, the law might have made French firms turn to foreign suppliers so as to avoid having to pay earlier.<sup>3</sup> Under this hypothesis, French firms may have turned to international markets to compensate the decrease in sales in the domestic market. Put otherwise, our results would not reflect a positive effect of the policy, but only a substitution from the domestic market to international ones. Our results are not consistent with this hypothesis. If anything, domestic sales were positively affected as well by the policy, not negatively affected.

Our work contributes to the literature investigating the role of leverage (Phillips, 1995; Chevalier, 1995) and of cash holdings (Frésard, 2010; Boutin et al., 2013) in the product market decisions of firms and their rivals. In a seminal paper, Chevalier and Scharfstein (1996) show theoretically that liquidity-constrained firms under-invest in the acquisition of customers as they discount more future cash-flows.<sup>4</sup> The authors find evidence that financially constrained supermarkets raise their prices more during economic recessions.<sup>5</sup>

Unlike previous research, we are able to jointly track prices, quantities *and* the identity of customers and thus provide the first direct evidence of a causal effect of liquidity constraints on the dynamics of customer capital. Our results, moreover, contrast with the existing literature by emphasizing the role of non-price strategies in the creation of a customer base. This finding is in line with recent research suggesting that firms might be primarily investing in the acquisition of

<sup>&</sup>lt;sup>3</sup>Demir and Javorcik (2018) and Singh (2017) show that firms compete not only through prices but also through the provision of trade credit.

<sup>&</sup>lt;sup>4</sup>Dou and Ji (2018) embed the model of Chevalier and Scharfstein (1996) in a dynamic general equilibrium setting. They show that both precautionary cash holdings and general equilibrium effects tend to reduce the sensitivity of prices to aggregate shocks.

<sup>&</sup>lt;sup>5</sup>Gilchrist et al. (2017) recently reexamined this theory in the context of the 2008 financial crisis and showed using Compustat data that liquidity-constrained firms were responsible for the lack in deflationary pressures following the large decrease in demand. See also Campello (2003).

customers through marketing and advertising activities.<sup>6,7</sup> Our paper therefore suggests that in the presence of customer search costs, financially constrained firms may not necessarily charge higher prices during recessions but instead cut advertising expenditures.

By uncovering a causal link between financing capacity and customer accumulation, our results resonate with recent literature emphasizing the role of demand factors in the determination of firm size. Hottman, Redding and Weinstein (2016) use barcode data to show that 50 to 75 % of the heterogeneity in firm size is explained by variations in demand, while less than 20% is driven by differences in technical efficiency. Similarly, Bernard et al. (2019) find that 81% of the variation in firm sales in the Belgian production network originate from factors related to the number and the identity of customers. Our results provide one explanation for this heterogeneity in demand, as differences in customer capital can be traced back to the presence of financing frictions.

Our work also relates to the literature studying the role of financial factors in shaping export dynamics. Manova (2013) and Chaney (2016) argue that in presence of financing constraints, export market activity is not only determined by profit considerations as in Mélitz (2003) but also by the capacity to sustain the liquidity needs generated by international transactions. Using the 2008 crisis as an exogenous decrease in bank credit supply, Paravisini et al. (2014) show that access to credit affects the intensive margin of exports, but find no effect on the probability to enter or to exit a destination. The authors conclude that credit constraints act as an increase in the variable cost of exports. By contrast, our results indicate that liquidity constraints limit the ability of firms to invest in customer capital.

Section 2 briefly presents the institutional details of the policy and discusses its effects on firms' access to liquidity. The different data sets and descriptive variables are presented in

<sup>&</sup>lt;sup>6</sup>Using micro data on Irish exporters, Fitzgerald, Haller and Yedid-Levi (2016) observe that while prices stay unchanged, export quantities substantially increase with time spent in a market. Based on a structural model, they estimate that 20 to 30% of firm cash flows are devoted to non-price investments in the customer base. See also Fitzgerald and Priolo (2018).

<sup>&</sup>lt;sup>7</sup>Dou et al. (2019) show that firms' ability to attract key talents affects the attractivity of their brands. Higher wages for key talents may therefore constitute a form of non-price investment in customer capital.

<sup>&</sup>lt;sup>8</sup>This area of research has explored the role of demand variation on industry dynamics (Foster, Haltiwanger and Syverson, 2008, 2016; Dinlersoz and Yorukoglu, 2012), the size distribution of firms (Hottman, Redding and Weinstein, 2016; Arkolakis, 2016), the relation between Tobin's q and investment (Gourio and Rudanko, 2014).

<sup>&</sup>lt;sup>9</sup>See also Caggese and Cuñat (2013), Feenstra, Li and Yu (2014) or Schmidt-Eisenlohr (2013) for theoretical contributions and Amiti and Weinstein (2011), Minetti and Zhu (2011) for empirical ones.

section 3. Section 4 breaks down the different steps of the identification strategy. The results of the main estimations as well as of various robustness checks are given in section 5. We investigate the economic channels of the policy in section 6. Section 7 look at how firms invest in customer capital and section 8 concludes.

# 2 Institutional and theoretical context

# 2.1 Presentation of the policy

Faced with a general increase in payment periods across European economies, the European Union called in the beginning of the 2000s on the member countries to take action against what was considered to be a financial burden on SMEs. In response, the French government passed a law in 2001 setting by default payment terms at thirty days after reception of the product. The 30-days limit was however only indicative and rarely applied in practice.

Acknowledging the limitations of the 2001 law, the French government enacted in 2006 a reform limiting contractual payment terms to thirty days in the trucking sector (see Barrot (2016) for more details). The "policy" extended this limit to any transaction involving French firms, regardless of the sectors they were operating in. The policy was voted in 2008 and was part of a large reform called "Law on the Modernization of the Economy" (or LME) implemented in 2009.

The policy prohibited firms as of January 1st 2009 from agreeing on contractual payment terms exceeding sixty days after reception of the invoice (or 45 days following the end of the month). The government ensured that the policy was implemented by introducing large sanctions for non-complying firms and by urging the French competition authority to conduct audits to detect bad payers. 12

<sup>&</sup>lt;sup>10</sup>The Law of Modernization of the Economy was not limited to payment periods. The law introduced a broad set of measures: simplified procedures for self-employers, removal of regulatory hurdles to apply for public procurement contracts, etc. More importantly, the law facilitated price discrimination between suppliers and customers. These measures are however not a concern for identification. Indeed the payment periods reform is the only one relying a specific payment periods threshold. Consequently, the exposure of firms to the payment periods reform through their distance to this threshold is very unlikely correlated with the other LME measures.

<sup>&</sup>lt;sup>11</sup>Importantly, asking suppliers to delay their invoices is considered as an abusive practice and is subject to important sanctions.

<sup>&</sup>lt;sup>12</sup>Contractual payment terms exceeding the legal limit must be reported to public authorities by firms' accounting

Importantly, the policy solely applied to transactions contracted under the French trade code. Therefore, it did not directly affect exporters as they could circumvent the cap on payment terms by contracting with the importer under the trade code of the foreign counterpart or the CISG<sup>13</sup> international trade code.<sup>14</sup>

The legislators were aware that a "one-size-fits-all" approach could have been detrimental to the economic activity of some firms or even impossible to implement in practice. As a result, some temporary derogations were granted for some sectors of activity. The complete list of derogations is displayed in appendix A. We discuss how derogations are dealt with in the presentation of the empirical setting.

To illustrate the policy and its implementation, figure 1 displays the evolution of days of sales outstanding between 1999 and 2013 in the manufacturing and wholesale sector (the data sets and the construction of the measures are described in section 3) for firms whose total exports represent less than 10% (blue solid line) and more than 50% (red dashed line) of total sales on average. The introduction of the policy is correlated with a dramatic decrease in payment periods for firms operating mainly in the domestic market, from around 77 days in 2007 to 71 in 2009.

### [Insert figure 1 here]

A few comments are in order here. First, exporters consistently face longer payment periods than domestic firms, which is consistent with the idea that transportation time comes on top of payment periods. Moreover, while payment periods decreased markedly for domestic firms before 2009, there is no break in the trend for firms operating mainly in international markets. This confirms that the policy did not directly affect international transactions, and left unaffected firms operating mostly in international markets.

Second, the sharp decline of payment periods one year before the implementation of the law reflects that the law has largely been anticipated (ODDP, 2009). Professional organizations

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auditors. Penal procedures can be initiated in case of a violation and may result in a 75,000 euros fine. Non-complying firms are subject to civil sanctions amounting up to 2 millions euros. In 2015, for instance, a major telecom group had to settle a fine of 750 000 euros following several complaints from suppliers. See TelecomPaper.com (2015).

<sup>&</sup>lt;sup>13</sup>Convention on Contracts for the International Sale of Goods, also known as the Vienna Convention)

<sup>&</sup>lt;sup>14</sup>See Le Roch and Bricq (2013) for more details (in French)

were indeed aware of the legislation since they were part of its preparation. Moreover, French firms are required by the law to publish their general terms and conditions in the first quarter of each year. This document notably details the menu of unit prices and payment conditions for the year to come. In order to comply with the policy as of January 1st 2009, firms had therefore to apply this rule in advance.

Finally, one might also suspect that the decrease in payment periods have been caused by the coincident 2008 financial crisis. If anything, however, the crisis lead firms to further delay their payments, not shorten them (Garcia-Appendini and Montoriol-Garriga, 2013). Moreover, payment periods approximately stayed at their 2009 level in 2012 even though the financial conditions had largely returned to normal in the meantime. The persistence of the reduction in payment periods strongly suggests that the observed drop between 2007 and 2009 was not driven by the financial crisis.

# 2.2 Trade credit provision and liquidity constraints

Should a cap on payment terms mitigate firms' liquidity constraints? Traditional analysis of trade credit would give the opposite prediction. Given the large cost of trade credit, the corporate finance literature has rationalized the presence of interfirm lending as an optimal answer to liquidity frictions affecting customers. The different theories based on this idea predict that trade credit flows from large, creditworthy suppliers to small and financially constrained customers. Consistently with this view, Garcia-Appendini and Montoriol-Garriga (2013) show that liquidity-rich suppliers increased their provision of trade credit to liquidity-poor customers during the 2008 financial crisis.

[Insert figure 2 here]

Traditional view have been challenged by empirical studies showing that firms with high bargaining power actually receive trade credit from smaller, potentially financially constrained

<sup>&</sup>lt;sup>15</sup>Ng, Smith and Smith (1999) estimate the cost of trade credit to be as high as 44% in annualized terms.

<sup>&</sup>lt;sup>16</sup>By assumption, in the absence of trade credit, customers would be unable to finance their purchases through bank credit. Suppliers may then fill the void left by banks because of a greater ability to screen customers (Smith, 1987; Biais and Gollier, 1997), to prevent fund diversion (Burkart and Ellingsen, 2004; Cunat, 2007) or to liquidate intermediate goods (Long, Malitz and Ravid, 1993). Providing trade credit to customers is optimal from the point of view of suppliers as it allows to increase total sales.

suppliers. (Klapper, Laeven and Rajan, 2012; Fabbri and Klapper, 2016). <sup>17</sup> Murfin and Njoroge (2015) shows that the provision of trade credit depletes small firms' internal funds, leading them to cut back capital expenditures. Under this view, capping payment terms might be a way to limit the transfer of liquidity from small supplier to dominant firms through the provision of trade credit.

There are good reasons to believe that the second view prevails in our case. Figure 2 plots the average payment periods from customers faced by firms in our data set for the year 2007. Firms are sorted by size decile, which we measure using total sales. The distribution of payment periods shows that small firms were disproportionately exposed to long payment periods, which is hard to reconcile with the first view of trade credit. Looking at the effects of an early implementation of the policy in the trucking sector in 2007, Barrot (2016) finds that the cap on payment periods lead to a decrease in working capital needs and to lower rates of corporate defaults. This finding strongly supports the hypothesis that long payment periods exacerbates liquidity constraints.

Note we do not take a strong stance on whether a cap on payment delays is in itself welfare-improving or not. Our focus is on the effects of the policy on the accumulation of customer capital, and a detailed analysis of the distortions introduced by the cap would accordingly be beyond the scope of the paper. We take however into account the potential negative effects of the cap when they can prove to be a danger for identification. In particular, the restriction on payment terms may have made suppliers less able to attract or to retain domestic customers though the provision of trade credit (Breza and Liberman, 2017; Demir and Javorcik, 2018; Singh, 2017). This observation motivates our focus on international transactions as they were not directly affected by the policy. Our empirical analysis attempts therefore at capturing the effects of a cap on payment periods from domestic customers on the expansion of the set of international customers.

<sup>&</sup>lt;sup>17</sup>Anecdotal evidence suggests that the financial gains at stake are massive for high bargaining power firm. In 2015, for instance, when Procter & Gamble unilaterally extended its payment terms to all its suppliers by 30 days the cash balance of the firm to nearly double (Esty, Mayfield and Lane, 2016).

# 2.3 A stylized model of investment in customer capital

In this subsection, we conduct a partial equilibrium analysis of the role of liquidity constraints in the accumulation of customer capital. Our stylized model delivers testable predictions which will guide the empirical analysis.

We consider a unique representative firm facing a continuum of identical customers present in one single product market. There are two periods denoted by 1 and 2. By simplicity, the risk-free interest rate is set equal to zero. A commercial transaction with a customer delivers with certainty profit a > 0 to the firm at time 2. The exogenous parameter a reflects both the profitability of the firm and the level of demand in the product market.

Firms must undertake marketing activities to match with x customers. The level of marketing expenditures rise with the targeted number of customers and is given by  $cx^{\rho}$ . Both c>0 and  $\rho>1$  are exogenously determined. The matching with customers is assumed to take place in two steps: potential customers are made aware of the existence of the firm at time 1 ("customer acquisition"), and induced to trade with firm f at time 2 ("customer retention"). Accordingly, the firm spends a fraction  $0<\gamma<1$  of total marketing expenditures at time 1 in customer acquisition and the remaining share  $1-\gamma$  at time 2 in customer retention.

The temporal structure of marketing expenditures (governed by the parameter  $\gamma$ ) is determined by the intensity of product market frictions. When it is costly to identify customers (high search costs) or to switch suppliers (high input specificity), customer acquisition is likely to be more important for the firm (high  $\gamma$ ). Conversely, firms operating in fluid product markets are likely to devote relatively more effort to maintain their existing customer base (low  $\gamma$ ). <sup>18</sup>

Liquidity constraints are introduced by assuming that the firm can not obtain more than a fraction  $0 < \kappa < 1$  of its future sales to finance customer acquisition spending in period 1:

$$\gamma c x^{\rho} \le \kappa a x$$
 (1)

<sup>&</sup>lt;sup>18</sup>The optimal mix between acquisition and retention spending is the subject of a wide literature in marketing (for instance, see Reinartz, Thomas and Kumar (2005); Ovchinnikov, Boulu-Reshef and Pfeifer (2014)). Min et al. (2016) show in particular that retention spending is the most cost-efficient way of investing in customer capital in competitive markets.

We borrow this specification of the working capital constraint from Bigio and La'o (2016). <sup>19</sup> A low parameter  $\kappa$  makes the liquidity constraint more severe.

The specification of marketing costs implies that without liquidity constraints, the firm would spend a fraction  $1/\rho$  of its sales in marketing. It follows that the firm is liquidity constrained if and only if

$$\frac{\kappa}{\gamma} < \frac{1}{\rho} \tag{2}$$

Equation 3 states that all other things equal, a firm is more likely to be liquidity-constrained when the product market is frictional (high  $\gamma$ ). The reason for this is that a greater share of marketing expenditures has to be financed in advance, leading the working capital constraint to bind more easily. Firms are also more likely to be liquidity constrained when marketing costs increase less quickly with the number of targeted customers (lower  $\rho$ ). Writing  $\xi = \min(1/\rho, \kappa/\gamma)$ , it follows immediately that at the optimum, the number of customers  $x^*$  is given by

$$x^* = \left(\frac{a\xi}{c}\right)^{\frac{1}{\rho-1}} \tag{3}$$

cost of marketing c. We can see moreover that the size of the customer base does not depend on product market frictions when the firm is not liquidity constrained. This allows us to write **Proposition 1.** Following a positive liquidity shock (increase in  $\kappa$ ), investment in customer capital will increase more in the presence of high financing or product market frictions. In particular, investment in customer capital is not be affected by the shock if the firm is not

Investment in customer capital is increasing in the value of a customer a and decreasing in the

We test the different implications of the proposition in the remaining part of the paper.

# 3 Description of the data sets

*liquidity constrained ex ante* (ie,  $\kappa/\gamma \ge 1/\rho$ ).

We use firm-level data sets coming respectively from the French customs (firm-to-firm exporting transactions), the French fiscal administration (balance sheet as well as profit and loss

<sup>&</sup>lt;sup>19</sup>Bigio and La'o (2016) show in particular how the constraint can be micro-founded in a limited commitment setting.

statements) and the French National Institute of Statistics (Insee). The different sets of data are merged via a unique firm identifier.

#### 3.1 Customs data

We use a French custom data set which records any transaction between 2003 and 2012 involving a French exporter and an importing firm located in the European Union. For each transaction, the data set records the identity of the exporting firm (its SIREN identifier), the identification number of the importer (VAT number), the date of the transaction (month and year), the product category (at the 8-digit level of the combined nomenclature) and the value of the shipment. On average, 85% of French exports in value are realized every year by importing firms that were also present the year before, a sign of the good quality of the customer identifier. We follow Bergounhon, Lenoir and Mejean (2018) for the remaining data cleaning.

In most of the following analysis, the data is aggregated at the firm f, year t and country m level. For a given (f, m, t)-triplet, however, we distinguish exports realized with a customer c active with firm f at both time t and t-1 (*stable* customer), not active at time t-1 but is at time t (*new* customer), or active at time t-1 but not at t (*lost* customer). Export growth is then computed as:

$$\Delta Exports_{f,m,t} = \frac{2 * (Exports_{f,m,t} - Exports_{f,m,t-1})}{(Exports_{f,m,t} + Exports_{f,m,t-1})}$$

$$= \frac{2 * (Exports_{f,m,t}^S - Exports_{f,m,t-1}^S)}{(Exports_{f,m,t} + Exports_{f,m,t-1})} + \frac{2 * (Exports_{f,m,t}^N - Exports_{f,m,t-1}^L)}{(Exports_{f,m,t} + Exports_{f,m,t-1})}$$

$$= \Delta Stable \ customers_{f,m,t} + \Delta Customer \ base_{f,m,t}$$

$$(4)$$

where the subscripts S, N and L respectively denote stable, new and lost customers.

To measure exports growth, we use the "mid-point" growth rate introduced by Davis, Haltiwanger and Schuh (1996) as it is conveniently bounded.<sup>20</sup> This decomposition allows to separate the share of the growth of exports that is due to a variation of sales with existing customers ( $\Delta Stable\ customers_{f,m,t}$ ) from the contribution of the evolution of the customer base

<sup>&</sup>lt;sup>20</sup>Our results are entirely robust to alternatively using either the "classical" growth or the difference in logs.

 $(\Delta Customer\ base_{f,m,t}).^{21}$ 

The extensive margin is analyzed through the lens of the variables  $Entry_{f,m,t}$  and  $Exit_{f,m,t}$  which are respectively equal to 1 when firm f enters (exits) country m at time t. By construction,  $Exit_{f,m,t}$  ( $Entry_{f,m,t}$ ) is only defined if firm f was exporting (was not exporting) in country m at time t-1.

# 3.2 Profitability, capital structure, sales by sector

The second data set comes from BRN-RSI tax returns collected by the French fiscal administration. This data set gives accounting information for the whole universe of French firms in the private economy (excluding the financial and agricultural sectors) between 2003 and 2012. In addition to balance sheet information, a 5-digits sector code (along the NACE, the EU economic activity nomenclature) is provided. As we focus on the effects of the policy on international transactions, we restrict our analysis to the two main exporting industries, the manufacturing and wholesale sectors. To correct for reporting errors we systematically replace outliers of all variables by missing values.<sup>22</sup>

To identify precisely the different sectors in which firms operate, we rely on an extensive yearly survey conducted by the Ministry of Industry (Enquête Annuelle des Entreprises, "EAE"). The survey is exhaustive for French firms with more than 20 employees or whose sales exceed 5 millions euros and records the amounts of sales realized by each surveyed firms in each 5-digits sector.<sup>23</sup> The total turnover of the firms included in the sample represents more than 95% of the aggregate turnover.

# 3.3 Measuring payment periods

Transaction-level payment information is not reported in our data set. Instead, we rely on balance sheet statements to compute a firm-level measure of the time taken to collect payment

<sup>&</sup>lt;sup>21</sup>We focus on export growth conditional on survival. Namely, we record  $\Delta Exports_{f,m,t}$  only when firm f exports in m both at time t and t-1.

<sup>&</sup>lt;sup>22</sup>We define an outlier as an observation that is superior (resp. inferior) to the median plus (resp. minus) three times the gap between the 5th and the 95th percentile

<sup>&</sup>lt;sup>23</sup>The firm-level sector code available in the tax returns corresponds to the business line in which the firm realizes the majority of its activity.

from clients:

$$Days \ of \ sales \ outstanding_{f,t} = \frac{Accounts \ receivable_{f,t}}{Sales_f} * 365$$

Accounts  $receivable_{f,t}$  gives the amount of sales that customers of firm f still haven't paid at time t. The ratio is multiplied by 365 to be interpretable in terms of days. Days of sales outstanding<sub>f,t</sub> reflects the average payment period between firm f and its customers for a given fiscal year t. Symmetrically, we estimate the average time taken for a firm to pay its suppliers by

$$Days \ payable \ outstanding_f = \frac{Accounts \ payable_f}{Purchases_f} * 365$$

We focus on days of sales outstanding in most of the analysis and we take the supplier side into account in robustness checks.<sup>24</sup>

Table 1 displays the sectors with the highest and lowest average value of DSO and DPO in 2007. Strikingly, high payment periods appear mostly in heavy industries. By contrast, low payment periods are observed nearly exclusively for food processing firms. This is consistent with the prediction of Long, Malitz and Ravid (1993) that product durability should be positively correlated with average payment terms.

Importantly, while this measure provide sensible information at the aggregate level, there might be important measurement errors at the firm-level. The computation method indeed assumes that accounts receivable (or account payable) are evenly distributed over the fiscal exercise. The instrumentation method described in the next section explicitly deals with this issue.

# 3.4 Final sample and descriptive statistics

<sup>&</sup>lt;sup>24</sup>Our identification relies on the breakdown of products or services sold to clients given by the EAE survey. By contrast, we do not know in which sectors the suppliers operate, which makes the analysis with days payable outstanding less precise (see next section).

As the identification strategy requires the breakdown of sales by sector, our final sample is restricted to firms present in the EAE survey. The description of the construction of the different variables is summarized in panel A of Table 2 and their distributions are presented in panel B. The data set contains 146,886 firm-year observations (approximately 16,300 firms per year) and accounts for approximately 80% of total export to the European Union by manufacturers and wholesalers between 2003 and 2012. Firms belong mostly to the manufacturing sector (71%) and are on average relatively mature (median age of 21 years). Panel B of table 2 shows moreover that average total assets is around 6.6 millions euros.

#### [Insert table 3 and table 4 here]

The average firm in our data set exports about 8 millions euros within the EU, is present in 6.9 markets and has 4.9 customers per destination within the European Union, as presented in 3. Table 4 shows that the number of customers increases with the number of years spent in a market, with about 8.8 customers on average after five years compared to 3.6 in the year of entry.

# 4 Identification strategy

Several specificities of the reform described in section 2.1 makes it challenging to use for causal inference:

- (a): Control group No natural control group emerges as this reform affects all sectors.
- (b): Unobserved heterogeneity As is shown in the literature, payment terms of a contract likely depend on the bargaining power of the firm which in turn might be correlated with its ability to export. OLS regressions of export patterns on the evolution of payment periods are therefore likely to be biased.
- (c): Measurement error Payment periods are only imperfectly observed and are only available at the firm-level (see subsection 3.3).
- (d): Financial crisis The payment delays reform happened simultaneously with the financial crisis which had a large impact on French exports (Bricongne et al., 2012). Not properly

accounted for, any inference would be subject to the risk of being contaminated by the confounding impact of the crisis.

We outline the strategy designed to address these points in the following subsections. The econometric design is based of three main components, namely the exploitation of the heterogeneity in exposure to the reform (subsection 4.1), the introduction of fixed effects at a granular level (4.2) as well as the use of control variables (4.3).

# 4.1 Description of the IV strategy

In the absence of a control group (item (a)), the heterogeneity in exposure to the reform is exploited as a source of identification. The sixty-days rule provides a natural reference point. Firms that had to wait 80 days to get paid prior to the reform should in principle have been impacted more than firms which were paid in 65 days. Moreover, the reform should have left suppliers that were already paid in less than 60 days virtually unaffected by the rule. We formalize this idea by defining

$$d(DSO,60)_f = \max(0, Days \ of \ sales \ outstanding_f - 60)$$

The maximum operator captures the fact that only firms facing payment periods higher than 60 days were exposed to the reform.

As mentioned in item (b) and (c), however, days of sales outstanding are only imperfectly observed and may be correlated to unobservable firm characteristics. We address these concerns by taking a step back and performing the analysis at the sectoral level. While payment conditions vary across sectors, they tend to be relatively homogeneous within a given product market (Ng, Smith and Smith, 1999). Most trade credit determinants emphasized in the literature are homogeneous at the sector-level.<sup>25</sup> Moreover, as firms use the provision of trade credit to compete with each other (Singh, 2017; Demir and Javorcik, 2018), payment terms should tend to be comparable within a sector. Consequently, firms which operate in sectors where the

<sup>&</sup>lt;sup>25</sup>Among them one can mention the degree of product market competition (Brennan, Maksimovic and Zechner, 1988), the degree of uncertainty on the quality of the product (Long, Malitz and Ravid (1993) and Lee and Stowe (1993)) and the information advantage of suppliers over banks to observe product quality or to enforce high effort (Smith (1987), Biais and Gollier (1997), Burkart and Ellingsen (2004) or Cunat (2007)).

distance to the sixty-days threshold was higher on average prior to the reform should have experienced a stronger liquidity shock.

This idea is implemented through the construction of a "shift-share" variable (Bartik, 1991)<sup>26</sup> defined by

$$\overline{d(DSO,60)}_{f,07} = \sum_{s} \omega_{f,s,07} \cdot d(DSO,60)_{s,07}$$

where  $\omega_{fs07} = Sales_{fs07}/Sales_{f07}$  is the share of firm f's sales in sector s in 2007 total sales (observed using the EAE survey) and

$$d(DSO,60)_{s,07} = \frac{1}{N_{s,07}} \sum_{g \in \Omega_{s,07}} d(DSO,60)_{g,07}$$

is the average distance to the threshold in sector s taken from the universe  $\Omega_{s,07}$  of all firms making less than 10% of their turnover abroad and operating primarily in sector s.<sup>27</sup> This variable captures the *ex ante* exposure to the reform based on the distance to the 60-days cap in the product markets in which the firm was operating in 2007: its main source of variability comes therefore from the heterogeneity across French firms in their product market portfolios.

#### [Insert figures 3 and 4 here]

As discussed in Borusyak, Hull and Jaravel (2018), two conditions are required for this shift-share variable to be considered as a valid exogenous factor: first, sectoral averages need to be uncorrelated to the individual unobserved characteristics, which will not be the case if for instance some firms are big enough to influence sectoral payment conditions. This concern is however mitigated by the fact that we take a simple average of days of sales outstanding within a sector<sup>28</sup> and that we only keep sectors in which we observe at least 10 firms. The second condition states that the 2007 heterogeneity in product market portfolio should not capture other factors that might affect export patterns. This potential issue is addressed in section 4.3 where the different control variables are defined.

<sup>&</sup>lt;sup>26</sup>See Berman, Berthou and Héricourt (2015) for another recent use of this type of strategy in an international trade setting.

<sup>&</sup>lt;sup>27</sup>The main sector of activity is observable for all French firms; the average distance is therefore computed using information on over 800 thousands companies. Sectors with less than 10 non-exporting firms are discarded.

<sup>&</sup>lt;sup>28</sup>Our results are broadly unaffected by changes of the definition of  $\overline{d(DSO,60)}_{f,07}$  such as using weighted averages in the computation of  $d(DSO,60)_{s,07}$  or including exporters in the set  $\Omega_{s,07}$ .

In addition to dealing with the problem of unobserved firm-level heterogeneity (item (b)), this instrumentation strategy has the advantage of limiting potential biases due to the use of an imperfect proxy of payment periods (item (c)). By definition, Days of sales outstanding<sub>f</sub> compares the amount of sales generated in the whole fiscal year to the amount of receivables recorded at the time of the tax report; payment periods from clients will therefore be overestimated if sales are concentrated at the end of the fiscal year. Taking sectoral averages should in principle mitigate this concern provided that measurement error are not too correlated within a sector. Second, by computing the average value of Days of sales outstanding<sub>f</sub> on the population of firms making less than 10% of their turnover abroad, we ensure that the exogenous variation induced by the reform is based on factors originating mostly from the domestic market. This removes a potential mechanical link between the evolution of the rate of payment collection and export activity.

The instrument is purposely not designed to take into account the derogations introduced by the law (see section 2.1). These exceptions might have been implemented because of some sector specific export market behavior. Consequently, introducing the exemptions in the computation of  $\overline{d(DSO,60)}_{f,07}$  would compromise the validity of the instrument. The first-stage estimation therefore only identifies the change in days of sales outstanding that can be explained by the sixty-days cap, leaving aside the effects of derogations. Put another way, the IV estimator captures the *local average treatment effect* (LATE) by relying only on the effects of the reform on the firms that were affected by and that applied the sixty-days rule (*compliers*).

The computation of the exposure to the reform has not so far exploited the time dimension of the data set. Yet, it is expected that the variation of payment periods should not be affected by the exposure to the reform prior to its implementation. The final definition of the instrument is therefore given by

$$\overline{d(DSO,60)}_{f,t} = 1[t \ge 2007] \cdot \overline{d(DSO,60)}_{f,07}$$

the dummy being chosen to equal one as soon as 2007 to account for a potential anticipation of the reform.

Figures 3 and 4 summarize the main steps of the strategy outlined in this subsection.<sup>29</sup> The

 $<sup>\</sup>overline{}^{29}$ In both figures, the sample is split in 100 percentiles along the x-axis; the ordinate axis display the average

x-axis in both graphics gives the value of 2007 days of sales outstanding as measured by

$$\overline{Days \ of \ sales \ outstanding}_{f,07} = \sum_{s} \omega_{f,s,07} \cdot Days \ of \ sales \ outstanding_{s,07}$$

where Days of sales outstanding<sub>s,07</sub> is the simple average of DSO in sector  $s.^{30}$  In figure 3, the y-axis represents the evolution of actual firm-level days of sales outstanding between 2007 and 2009. Firms that were facing payment periods from clients below 60 days in 2007 experienced a small decrease in days of sales outstanding after the implementation of the reform. There is by contrast a large and significant negative correlation between  $\overline{Days}$  of sales outstanding<sub>f,07</sub> and  $\Delta Days$  of sales outstanding<sub>f,07-09</sub> after the 60-days threshold. This indicates that our estimation method correctly detects the effects of the presence of the sixty-days rule on the variation of payment periods. Furthermore, figure 4 shows that there is no obvious correlation between the instrument and the evolution of payment periods between 2003 and 2005, which suggests that the pattern shown in figure 3 indeed reflects the effects of the implementation of the reform.

#### 4.2 Unit of observation

The identification assumption behind the IV strategy is that factors other than payment periods affecting export outcomes are not correlated to  $\overline{d(DSO,60)}_{f,t}$ . This condition will however not be met if for instance the financial crisis impacted more firms that were more exposed to the law. In particular, if exporters mostly affected by the reform were mainly present in countries where demand fell relatively more during the crisis, a "naive" estimation might erroneously conclude to a significant positive correlation between the variation in payment periods and export activity.

We take advantage of the disaggregated nature of exports data and introduce country-year fixed effects to take care of this potential issue. Instead of comparing total exports variations, the regressions will therefore be based on the comparison of export outcomes in a given country and in a given year between firms that were differently exposed to the reform. In robustness

value of the y variable in each percentile.

 $<sup>^{30}\</sup>overline{Days\ of\ sales\ outstanding}_{f,07}$  is therefore akin to a slightly modified version of  $\overline{d(DSO,60)}_{f,07}$  that does not account for the sixty-days rule.

checks, we rerun our regressions using different units of observation (firm, firm-year and firm-product-year) and sets of fixed effects to assess the influence of this choice on our results.

Studying export behavior at the level of the destination market entails however a special attention on inference issues: while the left-hand variable is observed at the level of the combination of a firm f, a country m and date t, the right-hand variables vary only at the firm-year level such that error terms  $\epsilon_{fint}$  will be correlated for a given firm f. We follow the econometric literature on that subject and cluster standard errors to allow for arbitrary patterns of cross-correlation between observations related to the same firm f.

# 4.3 Control variables and baseline specification

Control variables are included in the main specification to limit the effect of several sources of heterogeneity that might contaminate our estimation. Our main concern here is that the methodology designed to compute  $\overline{d(DSO,60)}_{f,t}$  may lead the instrument to inappropriately capture sectoral variations unrelated to payment periods that may affect export activity. For instance, the instrument variable might be positively correlated to the dynamism of the different product markets in which the firm operates. In order to account for this possibility, we introduce in the specification the weighted average of the growth rate of sectoral sales,  $\overline{Sales\ growth\ rate}_{ft}$  computed using the same methodology as the instrument. This variable therefore controls for the varying economic conditions that firm f experiences in the different sectors in which it operates.

The portfolio of product and services of the firm could then be endogenously determined by other variables related to export patterns such as productivity or size: we therefore include  $log(Total \, Assets)_{f,t-1}$  and  $Labor \, productivity_{f,t-1}$  (defined as the ratio value added to the number of employees) in the specification. Conversely, the characteristics of product markets might affect capital structure decisions; the literature emphasizes in particular the role of leverage as a way to deter entry from competitors (see for instance Chevalier (1995)). The heterogeneity in product markets portfolio might therefore be related to firms' financing choices, which in turn could affect export activity. The leverage variable  $Long-term \, debt/TA_{f,t-1}$  (defined as the ratio of debt of more than one year to total assets) is added to the set of control variables to address this

potential issue. Lastly, the time dimension of the data set is exploited by including firm fixed effects so as to remove the influence from time-unvarying unobservable firm characteristics (management quality, distance to the closest port...).

Bringing together the different elements of the identification strategy, our baseline equation is given by the 2SLS estimation of:

$$Y_{f,m,t} = \alpha_f + \gamma_{m,t} + \beta_1 \cdot \Delta Days \ of \ sales \ outstanding_{f,t} + \beta_2 \cdot X_{f,t} + \epsilon_{f,m,t}$$

$$\Delta Days \ of \ sales \ outstanding_{ft} = \delta_f + \eta_{m,t} + \theta_1 \cdot \overline{d(DSO,60)}_{f,t} + \theta_2 \cdot X_{f,t} + \nu_{f,m,t}$$

$$(5)$$

where  $Y_{f,m,t}$  is an exporting variable,  $\alpha_f$  and  $\delta_f$  are firm fixed effects,  $\gamma_{m,t}$  and  $\eta_{m,t}$  are countryyear fixed effects and  $X_{f,t}$  the set of firm-level control variables. We expect the reform to induce a downward adjustment of payment periods ( $\theta_1 < 0$ ), thereby lowering firms' liquidity risk and enhancing their propensity to export ( $\beta_1 < 0$ ).

# 4.4 Effects of the reform on payment periods

Before presenting the main results, this subsection assesses more formally the effects of the reform on payment periods; we estimate to that end

$$\Delta Days \ of \ sales \ outstanding_{ft} = \mu_f + \rho_t + \pi_1 \cdot \overline{d(DSO,60)}_{f,t} + \pi_2 \cdot X_{f,t} + \xi_{f,t} \tag{6}$$

Note that this step is not formally equivalent to an estimation of the first stage of equation 5.2 since we abstract here from the set of exporting countries in which firm f operates (the regression here is performed at the firm-level).

Table 5 displays the results of the different specifications. The coefficient  $\pi_1$  is significantly negative in all columns: the specifications 1 to 3 indicate that each additional day of distance to the sixty-days threshold is associated with a reduction of 0.09 to 0.13 day of client payment periods per year.

The coefficients associated to control variables give moreover some clues on the economic mechanisms behind the evolution of payment periods. Conditionally on time-invariant characteristics, firms that got bigger or more productive experienced lower days of sales outstanding (column 3), and got paid quicker. This is in line with the findings of Fabbri and Klapper (2016) that higher bargaining power is associated with more advantageous payment terms. Firms operating in booming sectors also faced higher payment periods. It may reflect a higher demand for trade credit from customers present in relatively less performing sectors.

# 5 Building a customer base under liquidity constraints

### 5.1 Main results

Table 6 displays the estimated effects of the policy on exports growth ( $\Delta Exports_{f,m,t}$ ) as well on the probability to exit or to enter a country ( $Exit_{f,m,t}$  and  $Entry_{f,m,t}$ ). Note that by construction, the size of the estimation sample changes with the dependent variable (see subsection 3.1). Column 1 presents the first stage regression of the  $\Delta Exports_{f,m,t}$  analysis: the  $\overline{d(DSO,60)}_{f,t}$  coefficient is equal to -0.10, which is within the range of estimates in table 5. Accordingly, the Kleibergen-Paap statistics presented in columns 2 to 4 go in favor of a rejection of the hypothesis of a weak instrument.

#### [Insert table 6 here]

The -0.037 coefficient for  $\Delta Exports_{f,m,t}$  means that a 10-days decrease in days of sales outstanding is estimated to cause an increase in the exports growth rate of 3.7 percentage points. Expressing the economic magnitudes in terms of sample standard deviation, we find that a 3-days decrease in DSO increases the growth rate of exports by 1 pp (compared to a sample mean of -1.1%), lowers the propensity to exit a country by 0.9 pp (sample mean: 14.7%) and raises the probability of entry by 0.1 pp (sample mean: 4.6%). As expected, firms operating in booming industries grew relatively more in countries where they were already present and were more (less) likely to enter (exit) a market. Conditionally on time-invariant characteristics, we

find size and productivity to be negatively correlated with export growth, probably reflecting the larger expansion capacity of small firms.

#### [Insert table 7 here]

Using equation (4) we decompose the growth of exports  $\Delta Exports_{f,m,t}$  into a component capturing the variation of exports with existing customers ( $\Delta Stable\ customers_{f,m,t}$ ) and another one reflecting the evolution of the customer base ( $\Delta Customer\ base_{f,m,t}$ ). Strikingly, the provision of trade credit seems to only affect the acquisition and the retention of customers. We further analyze the factors affecting the evolution of exports by decomposing the part of  $\Delta Customer\ base_{f,m,t}$  that is due to the arrival of new customers from the contribution due to the discontinuation of existing trade relationships: we find that approximately two thirds of the effects on  $\Delta Customer\ base_{f,m,t}$  is due to an increase in the acquisition of new customers and one third to a higher rate of retention of existing customers.

Taken together, these two tables allow us to state the main result of our analysis: reducing liquidity constraints favors firm-level exports growth at the extensive margin by expanding the set of international customers and does not affect the intensive margin of exports. We show in the following subsections that this result is fairly robust to alternative specifications and methodological choices.

## 5.2 Alternative specifications

Table 8 estimates the effect of a variation in domestic payment periods on the growth rate of exports using various alternative specifications. In the "Derogations" column, we tweak the definition of the instrument so as to incorporate the deviations to the sixty-days rule introduced by the law. While the sign of the coefficient stays unchanged, the magnitude in absolute value becomes much bigger (-0.275); since the derogations are likely to be endogenously determined, however, we tend to see our baseline coefficient as more representative of the actual elasticity.

#### [Insert table 8 here]

Interestingly, the OLS regression yields a positive  $\Delta Exports_{f,m,t}$  coefficient. This should come as no surprise as payment periods decreased simultaneously to the collapse in exports.

The OLS regression captures this simultaneity, leading to a positive correlation between the two. In the fourth column specification, the specification is estimated without country-year fixed effects (only firm and year fixed effects). The estimated coefficient is lower in absolute value (-0.028), suggesting that firms exposed to the reform tended to be more present in countries more adversely hit by the crisis. The estimated coefficient in the absence of firm fixed effects is close to the baseline result but is no longer significantly different from zero.

#### [Insert table 9 here]

In an influential paper, Bertrand, Duflo and Mullainathan (2004) argue that in presence of serially correlated outcomes, econometric estimations based on panel data with a limited number of individual entities might under-reject the null hypothesis as standard errors are likely to be under-estimated. As a robustness check, they recommend collapsing the data in a "pre" and "post" period and estimating the coefficient of interest on the resulting data set so as to limit the influence of the time dimension.

We accordingly reduce the dimension of our data in two steps. First, we sum all the exports at the firm-year level and estimate our baseline specification without the country dimension and with  $Y = \Delta Exports$  (first two columns). We can see that the negative and significant relationship between the variation of days of sales outstanding and export growth is still present even when abstracting from country level-variations.

In a second stage (next two columns), we remove the time dimension of the data by calculating the growth rate of firm total exports between 2006 and 2009.  $\Delta Days$  of sales outstanding is defined in this context as the long difference of days of sales outstanding between 2006 and 2009; it is instrumented by  $\overline{d(DSO,60)}_{f,06}$ . Once again, the causal relationship that we uncover resists to the change in the unit of observation and stays significant at the 5% whether we include controls or not.

In a similar setting, Paravisini et al. (2014) advocates for the use of country-product-time fixed effects so as to limit the influence of confounding composition effects. The estimated sensitivity of exports to domestic payment periods might indeed reflect that firms exposed to the policy were actually disproportionately exporting products experiencing relatively higher

foreign demand. We address this concern by estimating the regressions at the country-productyear level, a product being defined by a 3-digits code of the Classification of Products by Activity produced by the European Commission.

The last two columns of table 9 shows that our main conclusion stay unchanged: a fall in payment periods generates higher export growth. The magnitudes of the elasticity of export growth to payment periods are much larger than the baseline estimates (-0.310 in the last column). We observe however that export growth is both more dynamic (average of 3.4%) and more volatile (standard deviation of 1.4) at the country-product than at the country level which may partly explain this difference.

#### [Insert table 10 here]

Another potential concern with our empirical strategy relates the weights used to compute the instrumental variable. We use firms' past sectoral sales as a weight to compute the firmlevel average distance to the 60-days threshold. We argue that the weights are likely to depend primarily on technological constraints and on the sectoral specialization of the firm. It can be advanced, however, that the choice of the portfolio of sectors of a firm might be related to its capacity of acquiring customers. The statistical link between the exposition to the reform and the export behavior might as a consequence reflect the presence of these confounding factors. Since the latter are likely to vary little over time, we should under this hypothesis find evidence of such a statistical link even before the implementation of the reform. Subsection 5.4 shows that we don't.

Still, we check in table 10 that our results are not affected by the method of construction of the instrument. The first column displays the baseline estimate. In the second and third columns, the weights are based on 2006 sectoral sales and average sectoral sales between 2003 and 2006. The estimates are barely changed, which implies that our results are not driven by the precise timing of construction of the shift-share variable. In column 4 we compute the instrument as the simple average of the sectoral distance to the 60-days threshold (based on the presence in the sector in 2007) so as to remove the influence of the weights. The coefficient, though less precisely estimated, remains very close to the baseline estimate.

## 5.3 Accounting for both demand and supply of trade credit

[Insert figure 5 here]

We have not so far taken into account the role of the demand of trade credit addressed to suppliers. Since firms are both clients and suppliers, the reduction of the provision of trade credit granted to customers could be entirely offset by the diminution of supplier payment periods. To tackle this issue, we compare clients payment periods to the time taken by firm f to pay its suppliers, a measure of payment periods in *net terms*:

Net days outstanding<sub>f,t</sub> = 
$$DSO_{f,t} - \frac{Purchases_{f,t}}{Sales_{f,t}} \times DPO_{f,t}$$

The previous identification strategy is not relevant with this measure of payment periods as the distance to the sixty-days rule should no longer predict the effect of the policy. It remains true, however, that payment periods (from clients or to suppliers) should decrease all the more after the policy than they were previously more distant to the sixty-days threshold. This directly implies that a firm with a positive net days outstanding measure in 2007 should have experienced a decrease in *Net days outstanding* $_{f,t}$  after the implementation of the policy as days of sales outstanding should have decreased more than days payable outstanding.

This idea is illustrated by figure 5. In the industrial mechanical engineering sector, payment periods from clients (DSO) far exceeded payment periods to suppliers (DPO) before the reform with net days outstanding of 54 days in 2007. As DSO were much more distant to the sixty-days threshold, they decreased more than DPO. This resulted in net days outstanding of 42 days in 2009. Conversely, DPO were higher than DSO for wholesalers of non-specialized food in 2007, leading to net days outstanding of minus 12 days. Net days outstanding in this case increased after the reform, reaching minus 2 days. This mechanism implies that previous imbalances between DSO and DPO are predictive of the sign and the magnitude of the subsequent change in net days outstanding. We formalize this idea by instrumenting  $\Delta Net \ days \ outstanding_{f,t}$  by

$$\overline{Net\ days\ outstanding}_{f,t} = 1[t \ge 2007] \cdot \sum_s \omega_{f,s,07} \cdot \overline{Net\ days\ outstanding}_{s,06}$$

where  $\overline{Net\ days\ outstanding}_{s,07}$  denotes the average value of net days outstanding in sector s in 2007.

Tables 11 and 12 reproduce the results of the previous section using this alternative measure of payment periods. We can see that each additional day of imbalance between supplier and client periods is associated to a subsequent decrease in 0.01 day, meaning that the adjustment was much less pronounced in net terms than for client payment periods. We find that as with  $\Delta Days$  of sales outstanding<sub>f,t</sub>, a decrease in net days outstanding leads to higher growth of exports and a higher probability of entry. The effect on the probability of exiting a country, however, is no longer significant.

Strikingly, the magnitudes of the effects are much larger. This is in line with the intuition that a decrease in client payment periods *compared to supplier payment periods* is more important for the firm than the sole decrease in days of sales outstanding. Interestingly, we find this time  $\Delta Stable\ customers$  to be affected by the variation of net days outstanding; the magnitude of the coefficients indicates however that the effect on the customer base remains the main driver of the growth rate of exports, two thirds of the effects being attributable to  $\Delta Customer\ base$ .

## 5.4 Placebo and dynamics of the effects

This subsection assesses the distribution of the effects of the policy over time. It serves two main purposes. First, it is important to remove any doubt that the results might only reflect the presence of pre-existing trends. It could indeed be the case that firms more exposed to the reform were operating in industries that were already expanding prior to the enactment of the law. Second, analyzing the dynamics of the effects after the policy is revealing as it allows to understand whether the provision of trade credit has short- or long-run effects on the expansion of the firm.

[Insert table 13 here]

A natural way to investigate the dynamics of the effects of the policy is to interact the explanatory variable with time dummies in the baseline regression (equation 5.2). However, the estimation of this specification is not straightforward as it would require to include in the instrument set all the interactions of  $\overline{d(DSO,60)}_{f,t}$  with time dummies (see Wooldridge (2010)).

We choose therefore to replicate our estimation on three different subperiods. We follow figure 5 to focus on particular years: the *placebo* period takes place before the policy (2005-2006), the *treatment* period during the observed drop in payment periods (2007-2008) and the *long-term* period after the drop (2009-2010). Including 2009 in the last period allows to test whether the policy was partially or perfectly anticipated. For each subperiod, we include two years before the years of interest and we set the instrument variable systematically to zero for these first 2 years in order to make before/after comparisons.<sup>31</sup>

The coefficients of the different estimations are given in table 13. It is first striking that the relation between the variation of days of sales outstanding and  $\overline{d(DSO,60)}_{f,07}$  becomes negative and significant only for the 2005-2008 subperiod. Using the exact same methodology before the observed drop in payment periods in France, we find no systematic link between days of sales outstanding and export growth. This finding proves that our main specification does not capture any existing pre-trends. Our results eventually do not point to any long-term effects of the large drop in days of sales outstanding (2007-2010 coefficient). This result excludes in particular the possibility that firms might have benefited only temporarily of the policy by exclusively initiating short-term trade relationships. Under this this scenario, the effect would have resulted in a positive  $\Delta Exports_{f,m,t}$  coefficient after the reform (reversal to the mean).

<sup>&</sup>lt;sup>31</sup>More precisely, the first period encompasses the years 2003 to 2006. Similarly to our main analysis, we instrument the variation in payment periods by the distance to the sixty-days threshold in 2007. We set the instrument to zero for 2003 and 2004. The second period considers the period 2005 to 2008 and the instrument is set to 0 for years 2005 and 2006. The last period includes the period 2007 to 2010 and the instrument is set to 0 in 2007 and 2008. This last specification aims at measuring the potential long-term effects of the reform after the observed drop in days of sales outstanding.

# 6 How did the policy affect export growth?

# **6.1** Did the policy alleviate liquidity constraints?

We check in this subsection that the policy acted as a positive liquidity shock by studying how firms adjusted their capital structure following the change in payment periods. We look at the evolution of financial characteristics related to liquidity constraints (working capital needs, cash and drawn credit lines) induced by the drop in client payment periods. The effect of payment periods on long-term debt is also considered.<sup>32</sup> All variables are expressed as a ratio to the lag of total assets. We bring back the analysis to the firm-level; regressions are similar to equation 6 presented in section 4.4 with the financial characteristics mentioned above as dependent variables. The specification includes firm and year fixed effects.

#### [Insert table 14 here]

The first column of table 14 confirms that firms that experienced a decrease in days of sales outstanding benefited from lower working capital needs. They also exhibit higher cash ratios (column (2)). Interestingly, the coefficient on the cash ratio is very close in absolute value to the credit line coefficient (column (3)) but is of the opposite sign. This suggests a strong pattern of substitution between the two: in reaction to a decrease in payment periods from clients, firms draw less on their credit lines and hold more cash instead. The long-term debt coefficient is not statistically significant. This confirms that the reform affected only short-term financing conditions. Overall, the results of table 14 are consistent with the idea that lower payment periods from clients mitigated liquidity constraints.

As a complementary test, we check whether the effects of the policy are more visible for firms that we can expect to face more financial frictions (see subsection 2.3). Following the literature on the subject,<sup>33</sup> we proxy the intensity of financial constraints by the size of the firm (measured by the volume of total sales), the ratio of cash holdings over assets and of long-term debt over assets. We also draw on Bates, Kahle and Stulz (2009) and include the volatility of sales in the analysis, the idea being that firms whose sales are more volatile are more likely to

<sup>&</sup>lt;sup>32</sup>The leverage measure is accordingly removed from the set of control variables in this subsection.

<sup>&</sup>lt;sup>33</sup>See for instance Fazzari et al. (1988), Hadlock and Pierce (2010) or Almeida, Campello and Weisbach (2004).

be liquidity constrained (see Clementi and Hopenhayn (2006)). The three first variables are averaged for the period preceding the implementation of the policy (2003-2007). The volatility of sales is computed over the same period and normalized by the average amount of sales.

## [Insert table 15 here]

Table 15 presents the estimations of the effects of the policy on export growth on different sub-samples of firms. Each of the sub-samples is obtained by ranking firms according to the four indicators of financial constraints described above. Regressors are standardized (*ie*, demeaned and then divided by the standard deviation) separately for each sub-sample so as to make the estimated coefficients directly comparable across groups.

Columns (1) to (8) show that the coefficients are significant at the 5% level only for small firms, firms with low levels of cash, high levels of debt and exhibiting high idiosyncratic risk. Combined with the results of table 14, this finding strongly supports the idea that the decrease in payment periods affected export growth by easing the access to short-term financing of liquidity-constrained firms.

#### 6.2 Interaction between domestic and international sales

Restricting the contract set by capping payment terms between French firms might have unintended adverse consequences. In particular, since the policy applied only to transactions contracted under the French code, French customers might have decided to switch to foreign suppliers so as to benefit from more advantageous payment terms. Under this hypothesis, the positive impact of the policy on export growth might only reflect the presence of firms redirecting their activity to international markets in response to higher trade frictions in the domestic market.

#### [Insert table 16 here]

This scenario implies that (i) an exogenous decrease in payment periods from French clients should result in lower domestic sales and (ii) an exogenous decrease in payment periods to French suppliers should result in higher import shares (defined as the ratio of imports to total

purchases). We test this joint hypothesis in table 16. Columns (1) and (2) show that sales on the French territory did not decrease following the fall of payment periods. If anything, the specification with  $\Delta Net \ days \ outstanding_{f,t}$  points to a positive effect of the decrease in payment periods of domestic sales, suggesting that the relaxation of liquidity constraints also helped firms expand their activity with French customers.

The second part of the hypothesis states that when faced with an exogenous decrease in payment periods to domestic suppliers, firms chose to rely relatively more on foreign firms to source their inputs. This would translate into a negative relationship between the share of inputs that are imported (import share) and the evolution of payment periods to suppliers ( $\Delta Days\ payable\ outstanding_{f,t}$ ).<sup>34</sup> We find no evidence of a statistically significant link between the two variables. Taken together, these findings indicate that the observed growth in export markets does not originate from the disruption of trade relationships in the domestic market.

#### [Insert table 17 here]

Firms' presence in domestic and international markets may in turn have shaped their exposure to the reform. First, firms that imported a large fraction of their inputs should have benefited more from the policy. Indeed, they should have been paid more rapidly by their French customers while still being able to pay international suppliers in more than 60 days. We test this idea by sorting firms according to the sales-weighted average of 2007 sectoral import shares (following the same procedure as in last subsection. We find accordingly that the elasticity is significantly different from zero only for firms operating in sectors with high import shares. A potential limit of this analysis, however, is that sectors with a high penetration of imports tend in also to be sectors where exports represent a large part of total sales. The absence of effect in column 1 of table 17 may therefore be attributable to lower expansion opportunities in foreign markets for firms operating in sectors with low import shares.

Second, as firms with low market power are more likely to be hurt by disadvantageous payment terms (Klapper, Laeven and Rajan (2012)), they should benefit more from a regulation

<sup>&</sup>lt;sup>34</sup>The evolution of DPOs is instrumented by the sales-weighted average of the 2007 sectoral distance of payment periods to suppliers to the 60-days threshold. The weights are the same as for the baseline specification (share of sales realized by the firm in a given sector in 2007 total sales). This specification makes the assumption that days payable outstanding are homogeneous across firms operating in the same sector.

restricting long payment terms. To test this hypothesis, we split the sample based on the 2007 market share in France in their main sector of activity. In line with our hypothesis, we find that firms with a low domestic market share (low market power) are strongly impacted by the fall in payment periods, while dominant firms appear largely unaffected.

# 7 What are the costs of expanding the customer base?

# 7.1 Do firms attract new customers through lower prices?

Chevalier and Scharfstein (1996) study the pricing decisions of liquidity-constrained firms when customers find it costly to switch their suppliers. Suppliers choose prices by making a trade-off between present and future profits. While lower prices decreases current cash-flows, it attracts customers which should result in higher future expected profits. As liquidity-constrained firms value more current profits, they are likely to charge higher prices, resulting in lower investment in the customer base. An interpretation of our results along the lines of this theory would be that the liquidity shock lead firms to grow more in international markets by allowing them to charge lower prices.

### [Insert table 18 here]

We confront this hypothesis to data by looking at how product prices reacted to the variation of payment periods. If the policy allowed firms to attract more customers through lower prices, then we should observe a positive relationship between the variation of days of sales outstanding and the evolution of prices. To test for this hypothesis, exports are aggregated at the level of a product p (defined as an 8-digit item of the Combined Nomenclature)<sup>35</sup>, a firm f, a country m and a time t. Our proxy for price is given by the ratio of the volume of exports to the quantity of products sold ("unit value"). We specify our regression as

$$\Delta Price_{f,m,p,t} = \kappa_f + \chi_{m,p} + \psi_t + \zeta_1 \cdot \Delta Days \ of \ sales \ outstanding_{f,t} + \zeta_2 \cdot X_{f,t} + \upsilon_{f,m,p,t} \tag{7}$$

<sup>&</sup>lt;sup>35</sup>We harmonize through time the product nomenclature following the procedures of Pierce and Schott (2012) and Bergounhon, Lenoir and Mejean (2018).

where  $\kappa_f$  and  $\psi_t$  denote firm and year fixed-effects and  $\chi_{m,p}$  is a country-product dummy<sup>36</sup>. The variable  $\Delta Days$  of sales outstanding<sub>f,t</sub> is as usual instrumented by the ex ante exposition to the reform.  $\Delta Price_{f,m,p,t}$  is measured in growth rates.<sup>37</sup>

Table 18 presents the results of the estimations. The first stage coefficient is still negative and precisely estimated, albeit lower in magnitude than in the baseline estimation. By contrast, we find no evidence of a statistical link between the variation in days of sales outstanding and prices. The estimations yield otherwise sensible results for the determinants of prices. Firms facing positive labor productivity shocks, for instance, tend to charge lower prices. We also observe that firms operating in booming industries raise prices, potentially reflecting the reaction to an upward shift of the demand curve.

The absence of an average effect on prices may actually be hiding some heterogeneous patterns between customers. In particular, it could be that firms decrease prices with their new customers but simultaneously increase prices with their existing customer base. We look therefore separately at the evolution of prices for existing and new customers:

$$\Delta Price_{f,m,p,t}^{N} = \frac{Price_{f,m,p,t}^{N} - Price_{f,m,p,t-1}}{Price_{f,m,p,t-1}} \text{ and } \Delta Price_{f,m,p,t}^{S} = \frac{Price_{f,m,p,t}^{S} - Price_{f,m,p,t-1}}{Price_{f,m,p,t-1}}$$

with S standing for stable customers and N for new customers as in subsection 3.1. We replace consecutively in equation 7 the variable  $\Delta Price_{f,m,p,t}$  by the first and second components of the decomposition. The results are displayed in columns (3) and (4). The absence of significant coefficient for the variation of days of sales outstanding lead us to conclude that prices did not react to the policy both for existing and new customers.

#### 7.2 The role of search costs

The absence of effect on product prices suggests that firms are facing other types of costs to expand their set of customers. Non-price obstacles to the expansion of the customer base can be classified into two main types. Firms can face frictions to find and match with customers (*e.g.*,

<sup>&</sup>lt;sup>36</sup>Introducing country-product fixed effects  $\chi_{m,p}$  allows to control for "pricing-to-market" patterns; see Drozd and Nosal (2012) for instance on the subject.

<sup>&</sup>lt;sup>37</sup>We remove the influence of outliers by dropping the bottom 5 % and top 5% of unit values growth rates. Our results are entirely robust to alternative standard measures of the evolution of prices.

marketing costs, advertisement) or to meet with specific client requirements (*e.g.*, provision of trade credit, product customization). In other words, posting low prices will not allow a firm to expand its customer base if customers are unaware of the existence of the supplier (*search costs*) or if the product is not adapted to their needs (*input specificity*).

#### [Insert table 19 here]

If liquidity constraints limit the ability of firms to overcome non-price frictions to trade, then the sensitivity of exports to payment periods should be higher when trade relationships are costly to initiate (see subsection 2.3). We build several proxies of trade frictions to test this hypothesis. By convenience, we come back to the setting of table 9 and define a product as 3-digits code of the European product classification.<sup>38</sup>

We rely on the classification of products established by Rauch (1999) to build a first proxy of trade frictions. Products are labelled as "homogeneous" if they are traded on an organized exchange (e.g., cereals) or reference priced (e.g., construction materials) and "differentiated" otherwise. Rauch show that when products are differentiated, geographical proximity as well as cultural ties better predict bilateral country-level trade volumes. Attributing an integer to each of the modality of the Rauch nomenclature, we compute the sales-weighted average of the score for each observation (a higher value being associated to a larger share of differentiated products).

A limitation of this measure is that it focuses only one source of trade frictions, namely the way product markets are organized. We turn to that end to the "relationship stickiness" index recently introduced by Martin, Mejean and Parenti (2018). The index is based on the average length of firm-to-firm relationships in various product markets. Intuitively, long average trade relationships in a product market signal the presence of high switching costs, be it be because of the difficulty to find alternative suppliers or a high specificity of the traded inputs.

In practice, the duration of a trade relationship for a given product is measured as the time (in months) between the first transaction between a seller and buyer and the first time the same

<sup>&</sup>lt;sup>38</sup>Variations of customer capital are difficult to interpret at a very disaggregated level. The CPA classification has moreover the advantage to be directly comparable to the French classification of sectors, which makes it more suited for our analysis based on sectoral heterogeneity in payment delays. Our results are however robust to changing the product classification or the unit of aggregation.

buyer interacts with a different French exporter.<sup>39</sup> Interpreting the length of trade relationships at the individual level is however not straightforward as a long spell can either be reflective of high switching costs or a good match quality between the buyer and the seller. Martin, Mejean and Parenti (2018) use the average export volume over the length of the transaction ( $Size_{b,s,p}$  for a buyer b, a seller s and a product p) as an indicator of the quality of the match. More precisely, denoting d a decile of  $Size_{b,s,p}$  for a given product and a given importing country c, we compute the average trade duration  $Duration_{c,p,d}$  in size-bin d and estimate<sup>40</sup>

$$\log(Duration_{c,p,d}) = FE_c + FE_p + FE_d + \epsilon_{c,p,d}$$

A high product fixed-effect  $\widehat{FE}_p$  ("relationship stickiness index") is interpreted as reflecting the presence of important frictions in the product market p.

We rank observations according to the two proxies of trade frictions (homogeneous versus differentiated product, relationship stickiness index below or above the median). Table 19 presents the results of the estimation on the different sub-samples. Estimated elasticities of export growth to payment periods appear to be statistically different from zero only when trade frictions are deemed to be high. This result goes in support of the idea that liquidity frictions hinder the expansion of the customer base by preventing suppliers from overcoming non-price obstacles to trade.

In a last empirical exercise, we use another dimension of our data set to highlight the role of product market frictions. Chaney (2014) show that trading with a firm in a foreign country (being "connected") subsequently reduces the costs to find trade partners in the same network. Importers that have already traded with French firms should therefore be easier to reach.<sup>41</sup> Every year, we identify new buyers that have never interacted with a French exporter before

<sup>&</sup>lt;sup>39</sup>To avoid having to deal with left- and right-censored data, we focus on transactions initiated after 2004 and terminated before 2011. If the buyer starts trading with a supplier he already interacted with, we consider that a new relationship is created. The duration of the second relationship is calculated independently of the first one.

 $<sup>^{40}</sup>$ We trim the data set so as to remove the observations that belong to the bottom and top 1% of  $Size_{c,s,p}$ .

<sup>&</sup>lt;sup>41</sup>For instance, connected importers may have adapted their production process to French standards (lower specificity of inputs) or be more aware of the existence of French suppliers (lower search costs).

("non-connected" firms) and define<sup>42</sup>

$$\frac{\textit{Exports}_{f,m,t}^{\textit{C}}}{0.5*(\textit{Exports}_{f,m,t} + \textit{Exports}_{f,m,t-1}^{\textit{C}})} = \frac{\textit{Exports}_{f,m,t}^{\textit{C}} + \textit{Exports}_{f,m,t}^{\textit{NC}}}{0.5*(\textit{Exports}_{f,m,t} + \textit{Exports}_{f,m,t-1}^{\textit{NC}})}$$

where *C* stands for "connected" and *NC* for "non-connected". Table 20 show that exports to non-connected firms increased more following the enactment of the policy, confirming that product market frictions are the main obstacle firms face to accumulate customer capital.

#### 7.3 Discussion of the results

In this subsection we briefly relate our results on liquidity constraints to the effects of trade costs on the extensive and intensive margins of trade. The significant effects of the policy on the propensity to enter and to exit a market shows that relaxing liquidity constraints helps firms finance the fixed and sunk costs of exports. This result is in line with the previous literature on the relationship between financial constraints and export behavior. Using aggregate data, Manova (2013) found that one third of the trade-specific effect of financial frictions takes place at the extensive margin of trade, suggesting an important effect of financing conditions on firm selection into exports. Conversely, using export-level data on Peruvian firms, Paravisini et al. (2014) concluded that the 2008 bank credit crunch affected exports solely through the intensive margin. While we find no results on the intensive margin - since we find no increase in sales to existing consumers - our results are consistent with Paravisini et al. (2014) given the more disaggregate nature of our data. Specifically, by using firm-to-firm trade data we are able to decompose the effects of liquidity shocks into export growth due to additional sales to existing customers and due to the evolution of the customer base; two effects that would appear entirely on the intensive margin when using aggregate trade flow data at the firm-level. Moreover, our results refine the conclusion of Paravisini et al. (2014) that better access to bank credit is observationally equivalent to a reduction in variable trade costs. We find that such equivalence does not hold for internal financing.

The conceptual framework of penetration costs introduced by Arkolakis (2010) allows to

<sup>&</sup>lt;sup>42</sup>The year 2003 is accordingly removed from the analysis.

rationalize the results we find both at the extensive margin and on the evolution of the customer base. In this setting, firms pay for each market a cost that is increasing in the number of customers in the market but that does not vary with the amount of sales realized to each customer. First, the effects that we uncover on the dynamics of the customer base are consistent with the idea that the increase in the rate of payment collection helped firms finance the penetration costs needed to build their customer capital. Then, by extension, the change in policy affected both the exit and entry rate into destinations through the impact on firms that were close to leaving or entering a new country (marginal firms).

That liquidity constraints affect customer capital (through penetration costs) rather than the intensive margin of exports (through variable costs) points to the large role of short-term financing conditions on aggregate trade. Indeed, in a recent empirical study, Bernard, Moxnes and Ulltveit-Moe (forthcoming) find that the number of importers (customer extensive margin) is twice as important as average value per importer (customer intensive margin) in the decomposition of the variation of total country exports. This suggests that the costs of reaching new customers might exert a far higher influence than variable costs on aggregate exports. It highlights the importance of the conditions of access to short-term financing for international trade.

### 8 Conclusion

This paper exploits a policy restricting payment terms between French firms as an exogenous liquidity shock to investigate the role of liquidity constraints in the accumulation of customer capital. Our results show that being paid earlier by domestic customers spurs export growth both at the intensive and extensive margins. Crucially, firms grow in export markets by expanding their set of customers, not by increasing sales with existing customers. Firms do not appear to attract new customers by offering lower prices. Instead, we observe that the expansion of the customer base is more pronounced when identifying and attracting customers is likely to be costly.

 $<sup>^{43}</sup>$ Penetration costs therefore regroup all the costs associated with the acquisition and the retention of customers (e.g., marketing costs, provision of trade credit).

Our findings show that liquidity constraints dampen the accumulation of customer capital by limiting the ability of firms to overcome product market frictions. This paper suggests therefore that the large heterogeneity in demand emphasized by recent research can be traced back to the presence of financing frictions. At the macroeconomic level, our results indicate that taking into account both product market and financing frictions might be important to understand the evolution of prices over the business cycle.

While we can not directly observe non-price investment in customer capital in the data, our results naturally point at marketing as an essential instrument to build and maintain a base of customers. Providing a detailed analysis of the role of the different types of marketing expenditures and of the financing costs they entail would constitute the logical next step towards a better understanding of the determinants of customer capital.

### References

- **Almeida, Heitor, Murillo Campello, and Michael S Weisbach.** 2004. "The cash flow sensitivity of cash." *The Journal of Finance*, 59(4): 1777–1804.
- **Amiti, Mary, and David E. Weinstein.** 2011. "Exports and financial shocks." *Quarterly Journal of Economics*, 126(4): 1841–1877.
- **Arkolakis, Costas.** 2010. "Market Penetration Costs and the New Consumers Margin in International Trade." *Journal of Political Economy*, 118(6): 1151–1199.
- **Arkolakis, Costas.** 2016. "A unified theory of firm selection and growth." *The Quarterly Journal of Economics*, 131(1): 89–155.
- **Barrot, Jean-Noël.** 2016. "Trade Credit and Industry Dynamics: Evidence from Trucking Firms." *The Journal of Finance*, 71(5): 1975–2016.
- **Bartik, Timothy J.** 1991. "Who Benefits from State and Local Economic Development Policies?" Chapter 1, 1–16. WE Upjohn Institute for Employment Research.
- **Bates, Thomas W, Kathleen M Kahle, and René M Stulz.** 2009. "Why do US firms hold so much more cash than they used to?" *The Journal of Finance*, 64(5): 1985–2021.
- **Bergounhon, Flora, Clemence Lenoir, and Isabelle Mejean.** 2018. "A guideline to French firm-level trade data." CREST Working Paper.
- **Berman, Nicolas, Antoine Berthou, and Jérôme Héricourt.** 2015. "Export dynamics and sales at home." *Journal of International Economics*, 96(2): 298–310.
- **Bernard, Andrew B, Andreas Moxnes, and Karen Helene Ulltveit-Moe.** forthcoming. "Two-sided heterogeneity and trade." *Review of Economics and Statistics*.
- Bernard, Andrew B, Emmanuel Dhyne, Glenn Magerman, Kalina Manova, and Andreas Moxnes. 2019. "The origins of firm heterogeneity: a production network approach." National Bureau of Economic Research.
- **Bertrand, Marianne, Esther Duflo, and Sendhil Mullainathan.** 2004. "How Much Should We Trust Differences-In-Differences Estimates?" *The Quarterly Journal of Economics*, 119(1): 249–275.
- **Biais, Bruno, and Christian Gollier.** 1997. "Trade credit and credit rationing." *Review of Financial Studies*, 10(4): 903–937.
- **Bigio, Saki, and Jennifer La'o.** 2016. "Financial frictions in production networks." NBER Working Paper.
- **Borusyak, Kirill, Peter Hull, and Xavier Jaravel.** 2018. "Quasi-experimental shift-share research designs." National Bureau of Economic Research.
- **Boutin, Xavier, Giacinta Cestone, Chiara Fumagalli, Giovanni Pica, and Nicolas Serrano-Velarde.** 2013. "The deep-pocket effect of internal capital markets." *Journal of Financial Economics*, 109: 122–145.
- **Brennan, Michael J, Vojislav Maksimovic, and Josef Zechner.** 1988. "Vendor financing." *The Journal of Finance*, 43(5): 1127–1141.
- **Breza, Emily, and Andres Liberman.** 2017. "Financial contracting and organizational form: Evidence from the regulation of trade credit." *Journal of Finance*.
- **Bricongne, JC., L. Fontagné, G. Gaulier, D. Taglioni, and V. Vicard.** 2012. "Firms and the global crisis: French exports in the turmoil." *Journal of International Economics*, 87(1): 134–146.
- **Burkart, Mike, and Tore Ellingsen.** 2004. "In-kind finance: A theory of trade credit." *American Economic Review*, 569–590.
- **Caggese, Andrea, and Vicente Cuñat.** 2013. "Financing constraints, firm dynamics, export decisions, and aggregate productivity." *Review of Economic Dynamics*, 16(1): 177–193.

- **Campello, Murillo.** 2003. "Capital structure and product markets interactions: evidence from business cycles." *Journal of Financial Economics*, 68(3): 353–378.
- **Chaney, Thomas.** 2014. "The network structure of international trade." *American Economic Review*, 104(11): 3600–3634.
- **Chaney, Thomas.** 2016. "Liquidity constrained exporters." *Journal of Economic Dynamics and Control*, 72: 141 154.
- **Chevalier, Judith A.** 1995. "Do LBO supermarkets charge more? An empirical analysis of the effects of LBOs on supermarket pricing." *The Journal of Finance*, 50(4): 1095–1112.
- **Chevalier, Judith A, and David S Scharfstein.** 1996. "Capital-market imperfections and countercyclical markups: Theory and evidence." *American Economic Review*, 86(4): 703.
- **Clementi, Gian Luca, and Hugo A Hopenhayn.** 2006. "A theory of financing constraints and firm dynamics." *The Quarterly Journal of Economics*, 121(1): 229–265.
- **Cunat, Vicente.** 2007. "Trade credit: suppliers as debt collectors and insurance providers." *Review of Financial Studies*, 20(2): 491–527.
- **Davis, Steven J, John Haltiwanger, and Scott Schuh.** 1996. "Small business and job creation: Dissecting the myth and reassessing the facts." *Small Business Economics*, 8(4): 297–315.
- **Demir, Banu, and Beata Javorcik.** 2018. "Don't throw in the towel, throw in trade credit!" *Journal of International Economics*, 111: 177 189.
- **Dinlersoz, Emin M., and Mehmet Yorukoglu.** 2012. "Information and Industry Dynamics." *American Economic Review*, 102(2): 884–913.
- **Dou, Winston Wei, and Yan Ji.** 2018. "External Financing and Customer Capital: A Financial Theory of Markups." "Working Paper".
- **Dou, Winston Wei, Yan Ji, David Reibstein, and Wei Wu.** 2019. "Customer Capital, Financial Constraints, and Stock Returns." Working Paper.
- **Drozd, Lukasz A., and Jaromir B. Nosal.** 2012. "Understanding International Prices: Customers as Capital." *American Economic Review*, 102(1): 364–395.
- Eaton, Jonathan, Marcela Eslava, Cornell J Krizan, Maurice Kugler, and James Tybout. 2014. "A search and learning model of export dynamics." Working Paper.
- **Eaton, Jonathan, Samuel Kortum, Brent Neiman, and John Romalis.** 2016. "Trade and the global recession." *American Economic Review*, 106(11): 3401–38.
- **Esty, Benjamin, Scott E Mayfield, and David Lane.** 2016. "Supply Chain Finance at Procter & Gamble." *HBS Case Study*.
- **Fabbri, Daniela, and Leora F Klapper.** 2016. "Bargaining power and trade credit." *Journal of Corporate Finance*, 41: 66–80.
- Fazzari, Steven M, R Glenn Hubbard, Bruce C Petersen, Alan S Blinder, and James M Poterba. 1988. "Financing Constraints and Corporate Investment; Comments and Discussion." *Brookings Papers on Economic Activity*, (1): 141.
- **Feenstra, Robert C., Zhiyuan Li, and Miaojie Yu.** 2014. "Exports and Credit Constraints under Incomplete Information: Theory and Evidence from China." *The Review of Economics and Statistics*, 96(4): 729–744.
- **Fitzgerald, Doireann, and Anthony Priolo.** 2018. "How Do Firms Build Market Share?" National Bureau of Economic Research.
- **Fitzgerald, Doireann, Stefanie Haller, and Yaniv Yedid-Levi.** 2016. "How Exporters Grow." National Bureau of Economic Research.
- **Foster, Lucia, John Haltiwanger, and Chad Syverson.** 2008. "Reallocation, Firm Turnover and Efficiency: Selection on Productivity of Profitability?" *American Economic Review*, 98(1): 394–425.

- **Foster, Lucia, John Haltiwanger, and Chad Syverson.** 2016. "The slow growth of new plants: Learning about demand?" *Economica*, 83(329): 91–129.
- **Frésard, Laurent.** 2010. "Financial Strength and Product Market Behavior: The Real Effects of Corporate Cash Holdings." *Journal of Finance*, 65: 1097–1122.
- **Garcia-Appendini, Emilia, and Judit Montoriol-Garriga.** 2013. "Firms as liquidity providers: Evidence from the 2007–2008 financial crisis." *Journal of Financial Economics*, 109(1): 272–291.
- **Gilchrist, Simon, Raphael Schoenle, Jae Sim, and Egon Zakrajsek.** 2017. "Inflation Dynamics during the Financial Crisis." *American Economic Review*, 107(3): 785–823.
- **Gourio, François, and Leena Rudanko.** 2014. "Customer Capital." *Review of Economic Studies*, 81: 1102–1136.
- **Hadlock, Charles J, and Joshua R Pierce.** 2010. "New evidence on measuring financial constraints: Moving beyond the KZ index." *Review of Financial Studies*, 23(5): 1909–1940.
- **Hottman, Colin J, Stephen J Redding, and David E Weinstein.** 2016. "Quantifying the sources of firm heterogeneity." *The Quarterly Journal of Economics*, 131(3): 1291–1364.
- **Klapper, Leora, Luc Laeven, and Raghuram Rajan.** 2012. "Trade credit contracts." *Review of Financial Studies*, 25(3): 838–867.
- **Lee, Yul W, and John D Stowe.** 1993. "Product risk, asymmetric information, and trade credit." *Journal of Financial and Quantitative Analysis*, 28(02): 285–300.
- **Le Roch, Jean-Pierre, and Nicole Bricq.** 2013. "Question number 25523." Minutes of the French National Assembly.
- **Long, Michael S, Ileen B Malitz, and S Abraham Ravid.** 1993. "Trade credit, quality guarantees, and product marketability." *Financial Management*, 117–127.
- **Manova, Kalina.** 2013. "Credit Constraints, Heterogenenous Firms and International Trade." *The Review of Economic Studies*, 80: 711–744.
- Martin, Julien, Isabelle Mejean, and Mathieu Parenti. 2018. "Relationship Stickiness: Measurement and Applications to International Economics." Working Paper.
- **Mélitz, Marc.** 2003. "The impact of trade on intra-industry reallocations and aggregate industry productivity." *Econometrica*, 71(6): 1695–1725.
- **Minetti, Raoul, and Susan Chun Zhu.** 2011. "Credit constraints and firm export: Microeconomic evidence from Italy." *Journal of International Economics*, 83: 109–125.
- Min, Sungwook, Xubing Zhang, Namwoon Kim, and Rajendra K Srivastava. 2016. "Customer acquisition and retention spending: An analytical model and empirical investigation in wireless telecommunications markets." *Journal of Marketing Research*, 53(5): 728–744.
- **Murfin, Justin, and Ken Njoroge.** 2015. "The implicit costs of trade credit borrowing by large firms." *Review of Financial Studies*, 28(1): 112–145.
- **Ng, Chee, Janet Smith, and Richard Smith.** 1999. "Evidence on the Determinants of Credit Terms Used in Interfirm Trade." *The Journal of Finance*, 54(3): 1109–1129.
- **ODDP.** 2009. "Rapport de l'observatoire des délais de paiement." Observatoire des délais de paiement.
- Ovchinnikov, Anton, Béatrice Boulu-Reshef, and Phillip E Pfeifer. 2014. "Balancing acquisition and retention spending for firms with limited capacity." *Management Science*, 60(8): 2002–2019.
- **Paravisini, Daniel, Veronica Rappoport, Philipp Schnabl, and Daniel Wolfenzon.** 2014. "Dissecting the Effect of Credit Supply on Trade: Evidence from Matched Credit-Export Data." *Review of Economic Studies*, 1–26.
- **Phillips, Gordon M.** 1995. "Increased debt and industry product markets: an empirical analysis." *Journal of Financial Economics*, 37(2): 189–238.

- **Pierce, Justin R., and Peter K. Schott.** 2012. "Concording U.S. Harmonized System Categories Over Time." *Journal of Official Statistics*, 28(1): 53–68.
- **Rauch, James E.** 1999. "Networks versus markets in international trade." *Journal of International Economics*, 48(1): 7–35.
- **Reinartz, Werner, Jacquelyn S Thomas, and Viswanathan Kumar.** 2005. "Balancing acquisition and retention resources to maximize customer profitability." *Journal of Marketing*, 69(1): 63–79.
- **Schmidt-Eisenlohr, Tim.** 2013. "Towards a Theory of Trade Finance." *Journal of International Economics*, 91(1): 96–112.
- **Singh, Manpreet.** 2017. "Financial Constraints and Trade Credit as a Strategic Tool: Evidence from Small-Scale Reservation Reforms in India." Working paper.
- **Smith, Janet Kiholm.** 1987. "Trade credit and informational asymmetry." *The Journal of Finance*, 42(4): 863–872.
- TelecomPaper.com. 2015. Link to the article.
- **Wooldridge, Jeffrey.** 2010. "Econometric Analysis of Cross Section and Panel Data." The MIT Press.

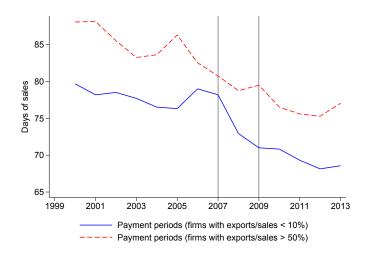
# **Appendix A** Derogations

This appendix gives the maximum contractual payment terms after the date of the invoice authorized by the LME reform. When the limit varies in 2009 (*e.g.* 120 days between January 01 and May 31 2009 and 80 days between June 01 and December 31 2009), we report the average number of days (100 days). When the supplier and the customer face different thresholds, the minimum payment limit prevails for the transaction.

- Purchases of living cattle: 20 days
- Purchases of perishable products, purchases of alcoholic beverages: 30 days
- Manufacture and sale of metal food packaging; record industry; recreational fishing; manual, creative and recreational activities: 75 days
- Construction industry; bathroom and heating equipment; sailing stores; industrial tooling; industrial hardware; steel products for the construction industry; automotive tools wholesaling: 85 days
- DIY stores; stationery and office supplies; tire industry; drugs with optional medical prescriptions; pet trade; garden stores; coatings, paints, glues, adhesives and inks; sports stores; leather industry; clothing sector: 90 days
- Jewellery, gold- and silversmiths' trade; round wooden elements; food supplements; optical-eyewear industry; cooperage: 105 days
- Firearms and ammunition for hunting: 115 days
- Quads, two- or three-wheeled vehicles, recreational vehicles:: 125 days
- Agricultural supplies: 150 days
- Toy stores: 170 days
- Book edition, agricultural machines: 195 days

## **Appendix B** Tables and figures

Figure 1: Evolution of days of sales outstanding between 1999 and 2013.



Source: Tax form data. Field: manufacturing and wholesale sector.

*Interpretation:* This graph displays the evolution of days of sales outstanding between 1999 and 2013 in the manufacturing and wholesale trade sectors. Days of sales outstanding are computed as the average ratio of accounts receivable over sales multiplied by 365. The blue solid line gives the evolution of days of sales outstanding for firms whose average share of exports in total sales is below 10%. The red dashed line gives the evolution of days of sales outstanding for firms whose average share of exports in total sales is above 50%.

84-(9002) \$82-80-76-0 2 4 6 8 10 Size decile (turnover, 2006)

Figure 2: Days of sales outstanding by firm size (2006)

Source: Tax form data. Field: manufacturing and wholesale sector.

*Interpretation:* This graph displays the average days of sales outstanding by decile of total sales (all values are taken in 2006). Days of sales outstanding are computed as the average ratio of accounts receivable over sales multiplied by 365.

Table 1: Top and bottom 5 sectors for client and supplier payment periods (2007).

Days of sales outstanding <sub>s</sub>		Days payable outstanding <sub>s</sub>	
Manufacture of non-metallic mineral products	145.1	Manufacture of ceramic sanitary	99.7
Manufacture of industrial gases	120.1	Manufacture of batteries	98.1
Manufacture of locomotives	119.7	Manufacture of fibre cement	82.8
Manufacture of steam generators	118.1	Manufacture of other mineral products	80.6
Manufacture of cement	112.6	Wholesale of beverages	80.2
Processing and preserving of potatoes	8.2	Bakery confectionery	30.5
Confectionery shop	6.7	Bakery products	30.4
Delicatessen	6.4	Processing of potatoes	28.7
Bakery	6.1	Cooked meats production and trade	28.1
Industrial bakery	5.0	Manufacture of medical equipment	32.3

Source: BRN-RSI tax returns in 2007. Field: manufacturing and wholesale sector.

Interpretation: This table displays the NAF 5-digits sectors in the manufacturing and wholesale sector with the highest and lowest values of average days of sales outstanding ( $\overline{Days\ of\ sales}\ outstanding_s$ ) and days payable outstanding ( $\overline{Days\ payable}\ outstanding_s$ ). Days of sales outstanding are computed as the average ratio of accounts receivable over sales multiplied by 365. Days payable outstanding are computed as the average ratio of accounts payable over purchases (multiplied by 365).

Table 2: Description of the data set.

	Panel A: Definitions of the variables
Export variables	
$\Delta Exports_{fmt}$	Variation of the amount of exports (in mid-point growth rate) of firm $f$ in market $m$ between $t$ and $t-1$ conditionally on firm $f$ being present in $m$ in $t$ and $t-1$ . Source: Customs.
$\Delta Stable\ customers_{fmt}$	Variation of the amount of exports of firm $f$ realized in market $m$ with customers with which firm $f$ trades in both $t$ and $t-1$ (scaled by the average of total exports in market $m$ between $t$ and $t-1$ ). <i>Source: Customs</i> .
$Entry_{fmt}$	Probability of firm $f$ entering market $m$ at time $t$ conditionally on firm $f$ being not present in $m$ at time $t-1$ . Source: Customs.
Exit <sub>fmt</sub>	Probability of firm $f$ exiting market $m$ at time $t$ conditionally on firm $f$ being present in $m$ at time $t-1$ . Source: Customs.
Lost customers <sub>fmt</sub>	Exports of firm $f$ realized in market $m$ with customers lost at time $t-1$ (scaled by the average of total exports in market $m$ between $t$ and $t-1$ ). Source: Customs.
$\Delta Customer\ base_{fmt}$	Exports of firm $f$ realized in market $m$ with new customers at time $t$ minus the amount of exports of firm $f$ realized in market $m$ with customers lost at time $t-1$ (scaled by the average of total exports in market $m$ between $t$ and $t-1$ ). Source: Customs.
New customers <sub>fmt</sub>	Exports of firm $f$ realized in market $m$ with new customers at time $t$ (scaled by the average of total exports in market $m$ between $t$ and $t-1$ ). Source: Customs.
Firm variables	
$\Delta Days \ of \ sales \ outstanding_{f,t}$	Variation of days of sales outstanding (see section 4.1). Source: BRN-RSI.
$\Delta Net \ days \ outstanding_{f,t}$ $Age_{f,t}$	Variation of net days outstanding (see section 5.3). <i>Source: BRN-RSI</i> . Age of the firm. <i>Source: BRN-RSI</i> .
Labor productivity $f, t-1$	Value added over the number of employees. Source: BRN-RSI.
$log(Total\ Assets)_{f,t-1}$	Logarithm of total assets (in thousand euros). Source: BRN-RSI.
$log(Turnover)_{f,t-1}$	Logarithm of turnover (in thousand euros). Source: BRN-RSI.
Long-term debt/TA <sub>f,t</sub>	Ratio of long-term debt to total assets. Source: BRN-RSI.
Sales growth $rate_{f,t}$	Sales-weighted average of sectoral sales growth rates between $t-1$ and $t$ . Source: EAE, BRN-RSI.
Instruments	
$\overline{d(DSO,60)}_{f,t}$	Sales-weighted average of the 2007 sectoral distance of days of sales outstanding to the 60-days threshold multiplied by a dummy equal to one after 2007 (see section 4.1). <i>Source: EAE, BRN-RSI.</i>
Net days outstanding $f_{t,t}$	Sales-weighted average of 2007 sectoral net days outstanding (see section 5.3). <i>Source: EAE, BRN-RSI.</i>

Panel B: Summary Statistics								
		Percentiles						
	# Obs.	Mean	Std. Dev.	5 <sup>th</sup>	$25^{\mathrm{th}}$	$50^{\mathrm{th}}$	$75^{\mathrm{th}}$	95 <sup>th</sup>
Dependent variables								
$\Delta Exports_{f,m,t}$	805013	-0.01	0.77	-1.41	-0.41	0.00	0.40	1.38
$\Delta Stable\ customers_{f,m,t}$	805013	-0.02	0.60	-1.11	-0.29	0.00	0.26	1.02
$Entry_{f,m,t}$	3473701	0.05	0.22	0.00	0.00	0.00	0.00	0.00
$Exit_{f,m,t}$	1029136	0.15	0.36	0.00	0.00	0.00	0.00	1.00
$\Delta Customer\ base_{f,m,t}$	805013	0.02	0.48	-0.76	-0.02	0.00	0.03	0.88
New customers <sub>f,m,t</sub>	805013	0.19	0.39	0.00	0.00	0.00	0.15	1.14
Lost customers <sub>f,m,t</sub>	805013	0.17	0.37	0.00	0.00	0.00	0.13	1.05
Independent variables								
$\Delta Days$ of sales outstanding <sub>f,t</sub>	146886	0.19	2.80	-3.68	-0.91	0.06	1.11	4.27
$\Delta Net \ days \ outstanding_{f,t}$	146886	-0.01	2.63	-3.79	-1.08	0.00	1.05	3.75
$Age_{f,t}$	146886	24.35	18.14	3.00	12.00	21.00	34.00	53.00
Labor productivity <sub>f,t</sub>	146886	0.07	0.05	0.03	0.04	0.06	0.08	0.15
$log(Total\ assets)_{f,t}$	146886	9.32	1.45	7.58	8.46	9.18	10.11	11.75
$log(Turnover)_{f,t}$	146886	9.62	1.21	7.91	8.76	9.48	10.37	11.86
LT debt/Assets <sub>f,t</sub>	146886	0.04	0.06	0.00	0.00	0.01	0.05	0.16
$\overline{Sales\ growth\ rate}_{f,t}$	146886	0.01	0.14	-0.22	-0.03	0.02	0.07	0.18
Instruments								
$\overline{d(DSO,60)}_{f,t}$	146886	32.82	13.54	7.83	24.35	35.34	40.90	51.07
Net days outstanding $f_{f,t}$	146886	8.92	21.70	-24.00	-6.17	7.66	23.63	45.26

*Source:* BRN-RSI, EAE, Customs data. *Field:* SMEs of the manufacturing and wholesale sector. *Interpretation:* The average value of the logarithm of the total value of assets (in thousand euros) across firm-year observations is 9.05.

Table 3: Export values and number of destinations served.

	Mean	Std. Dev.	P5	P25	P50	P75	P95
$Exports_{f,t}$ (k $\in$ )	8,031	45,186	9.05	164.60	773.14	3,290.26	30,173.26
$Exports_{f,m,t}$ (k $\in$ )	984.53	8007.50	4.68	41.27	139.73	476.95	3,476.41
$\#Destination_{f,t}$	6.96	5.22	1.00	3.00	6.00	10.00	18.00
$\#Client_{f,m,t}$	4.93	10.10	1.00	1.50	2.50	4.75	15.67

Source: Customs data. Field: SMEs of the manufacturing and wholesale sector.

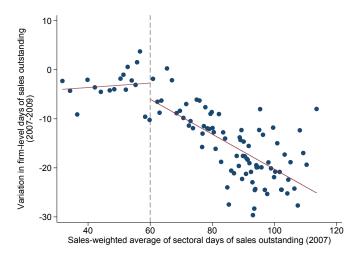
Interpretation: On average over the period 2003-2012, a French firm exports 985  $k \in$  per year and destination, serves 7 destinations and is in contact with 5 buyers within a market.

Table 4: Description of export dynamics at the customer- and market-level.

Level	#Years after entry:	1	2	3	4	5
Customer	Export value (mean)	73,745	154,203	216,314	271,597	440,095
Customer	Exit rate (%)	56	39	33	29	32
	Export value (mean)	495,196	795,472	1,017,846	1,170,753	1,719,273
Market	Exit rate (%)	28	16	11	9	6
	# customers (mean, UE)	3.55	4.98	5.96	6.71	8.8

Source: BRN-RSI, EAE, Customs data. Field: SMEs of the manufacturing and wholesale sector Interpretation: The table displays the average export value and exit rate at the customer- and market-level for the five years consecutive to the entry in a destination or to the formation of a new customer-supplier relationship. The last line indicate the evolution of the average number of customers per destination in the five years consecutive to the time of entry.

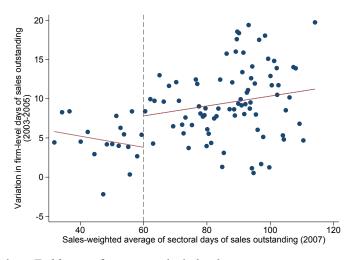
Figure 3: Impact of the policy on payment periods - treatment period.



Source: Tax form data. Field: manufacturing and wholesale sector.

Interpretation: This graph displays the evolution of Days of sales outstanding<sub>f,t</sub> between 2007 and 2009 as a function of  $\overline{Days}$  of sales outstanding<sub>f,2007</sub>. Days of sales outstanding<sub>f,t</sub> is computed as the firm-level ratio of accounts receivable over sales multiplied by 365.  $\overline{Days}$  of sales outstanding<sub>f,2007</sub> is computed as the average of the sectoral means of Days of sales outstanding<sub>g,2007</sub> weighted by the sales of firm f in each sector. The data set is split in 100 percentiles along the x-axis; the ordinate axis represents the average value of the y variable in each percentile.

Figure 4: Impact of the policy on payment periods - placebo test.



Source: Tax form data. Field: manufacturing and wholesale sector.

Interpretation: This graph displays the evolution of Days of sales outstanding<sub>f,t</sub> between 2003 and 2005 as a function of  $\overline{Days}$  of sales outstanding<sub>f,2007</sub>. Days of sales outstanding<sub>f,t</sub> is computed as the firm-level ratio of accounts receivable over sales multiplied by 365.  $\overline{Days}$  of sales outstanding<sub>f,2007</sub> is computed as the average of the sectoral means of Days of sales outstanding<sub>g,2007</sub> weighted by the sales of firm f in each sector. The data set is split in 100 percentiles along the x-axis; the ordinate axis represents the average value of the y variable in each percentile.

Table 5: Effects of the policy on payment periods.

	$\Delta D$ ays of sales outstanding $_{f,t}$				
	(1)	(2)	(3)		
$\overline{d(DSO,60)}_{f,t}$	$-0.110^{***}$	-0.090***	-0.126***		
<i>J</i> /-	(0.004)	(0.004)	(0.012)		
$log(Assets)_{f,t-1}$		$-0.345^{***}$	$-24.557^{***}$		
<i>J</i>		(0.068)	(0.746)		
$\overline{Sales\ growth\ rate}_{f,t}$		23.547***	9.587***		
·		(0.714)	(0.802)		
LT debt/Assets <sub>f,t-1</sub>		8.925***	$18.485^{***}$		
v		(1.229)	(2.485)		
Labor productivity <sub>f,t-1</sub>		9.571***	-30.436***		
<i>y</i> ,		(1.814)	(4.421)		
Observations	103153	103153	103153		
Firm FE	No	No	Yes		
Year FE	No	No	Yes		

The dependent variable is the variation of days of sales outstanding. Days of sales outstanding are computed at the firm-level as the ratio of accounts receivable over sales multiplied by 365. The main independent variable is  $\overline{d(DSO,60)_{f,t}}$  which is defined as the sales-weighted average of the 2007 sectoral distance of days of sales outstanding to the 60-days threshold multiplied by a dummy equal to one after 2007. Control variables include Labor productivity<sub>f,t-1</sub> (value added over the number of employees),  $log(Total \ Assets)_{f,t-1}$  (total assets in logarithm),  $long-term \ debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales \ growth \ rate_{f,t}}$  (sales-weighted average of sectoral sales growth rates) as well as the square and the cube of  $\overline{d(DSO,60)_{f,t}}$ . Regressions include firm and year fixed-effects. Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

Table 6: Payment periods and exports.

	$\Delta D$ ays of sales outstanding <sub>f,t</sub>	$\Delta Exports_{f,m,t}$	$Exit_{f,m,t}$	$Entry_{f,m,t}$
$log(Assets)_{f,t-1}$	-2.236***	-0.122***	0.003	0.009***
-	(0.073)	(0.040)	(0.019)	(0.003)
Sales growth rate <sub>f,t</sub>	0.682***	0.136***	-0.023***	0.009***
3/	(0.073)	(0.017)	(0.008)	(0.002)
LT debt/Assets <sub>f,t-1</sub>	2.062***	$0.087^{*}$	-0.035	0.008
•	(0.244)	(0.049)	(0.023)	(0.005)
Labor productivity <sub>f,t-1</sub>	-1.881***	-0.204***	0.005	-0.008
•	(0.437)	(0.068)	(0.035)	(0.008)
$\overline{d(DSO,60)}_{f,t} \times 10$	-0.100***			
3,7	(0.012)			
$\Delta Days \ of \ sales \ outstanding_{f,t} \times 10$		$-0.037^{**}$	0.030***	-0.004***
37-		(0.018)	(0.009)	(0.002)
Observations	805013	805013	940213	3473701
# Firms	17154	17154	18660	20190
Firm FE	Yes	Yes	Yes	Yes
Country-year FE	Yes	Yes	Yes	Yes
Kleibergen-Paap		72.2	78.3	250.2

The dependent variables are (in the order of the columns) the variation of days of sales outstanding (days of sales outstanding are computed at the firm-level as the ratio of accounts receivable over sales multiplied by 365), the variation of exports in market m for firms that stay in the market between time t and t-1, a dummy indicating whether firm f exits market m at time t and a dummy indicating whether firm f enters market m at time t. The instrument for the variation of days of sales outstanding is  $\overline{d(DSO,60)}_{f,t}$  which is defined as the sales-weighted average of the 2007 sectoral distance of days of sales outstanding to the 60-days threshold multiplied by a dummy equal to one after 2007. Control variables include  $Labor\ productivity_{f,t-1}$  (value added over the number of employees),  $log(Total\ Assets)_{f,t-1}$  (total assets in logarithm),  $Long\ term\ debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate_{f,t}}$  (sales-weighted average of sectoral sales growth rates). Regressions include firm and year fixed-effects. Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

Table 7: Effects of payment periods on the formation of a customer base.

	$\Delta Exports_{f,m,t}$	$\Delta Stable\ customer_{f,m,t}$	$\Delta Customer\ base_{f,m,t}$	New customers <sub>f,m,t</sub>	Lost customers <sub>f,m,t-1</sub>
$\Delta Days \ of \ sales \ outstanding_{f,t} \times 10$	-0.037**	-0.001	-0.036***	-0.023***	0.012*
,	(0.018)	(0.013)	(0.010)	(0.008)	(0.007)
$log(Assets)_{f,t-1}$	-0.122***	-0.023	-0.099***	-0.074***	0.025
	(0.040)	(0.028)	(0.023)	(0.018)	(0.017)
Sales growth rate <sub>f,t</sub>	0.136***	0.096***	0.040***	$0.024^{***}$	-0.016**
37	(0.017)	(0.012)	(0.010)	(0.007)	(0.006)
LT debt/Assets <sub>f,t-1</sub>	$0.087^{*}$	0.023	$0.065^{**}$	$0.072^{***}$	0.008
	(0.049)	(0.035)	(0.029)	(0.022)	(0.020)
Labor productivity <sub>f,t-1</sub>	-0.204***	$-0.169^{***}$	-0.035	-0.058**	-0.024
	(0.068)	(0.046)	(0.039)	(0.028)	(0.025)
Observations	805013	805013	805013	805013	805013
# Firms	17154	17154	17154	17154	17154
Firm FE	Yes	Yes	Yes	Yes	Yes
Country-year FE	Yes	Yes	Yes	Yes	Yes
Kleibergen-Paap	72.2	72.2	72.2	72.2	72.2

The dependent variables are (in the order of the columns) the variation of exports in market m between time t-1 and t, the variation of exports to customers in market m with whom firm f has a trade relationship at t-1 or at t, the variation of exports to customers acquired at t (lost at t-1) standardized by the average of total exports in market m of firm f between time t-1 and t. All the dependent variables are defined only for firms that stay in the market between t-1 and t. The instrumented variable is  $\Delta Days$  of sales outstanding<sub>f,t</sub> and is defined at the firm-level as the ratio of accounts receivable over sales multiplied by 365. The instrument for the variation of days of sales outstanding is  $\overline{d(DSO,60)}_{f,t}$  which is defined as the sales-weighted average of the 2007 sectoral distance of days of sales outstanding to the 60-days threshold multiplied by a dummy equal to one after 2007. Control variables include  $Labor\ productivity_{f,t-1}$  (value added over the number of employees),  $log(Total\ Assets)_{f,t-1}$  (total assets in logarithm),  $Long\ term\ debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate_{f,t}}$  (sales-weighted average of sectoral sales growth rates). Regressions include firm and year fixed-effects. Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

**Table 8: Alternative specifications.** 

	$\Delta Exports$						
	Baseline (1)	Derogations (2)	OLS (3)	No country-year FE (4)	No firm FE (5)		
$\Delta Days \ of \ sales \ outstanding_{f,t} \times 10$	-0.037**	-0.275*	0.012***	-0.028	-0.027		
J,-	(0.018)	(0.154)	(0.001)	(0.017)	(0.037)		
$log(Assets)_{f,t-1}$	$-0.122^{***}$	$-0.653^*$	-0.013**	$-0.102^{***}$	0.001		
**	(0.040)	(0.341)	(0.006)	(0.039)	(0.002)		
Sales growth rate <sub>f,t</sub>	0.136***	0.304***	0.102***	0.131***	0.148***		
37	(0.017)	(0.111)	(0.010)	(0.016)	(0.036)		
LT debt/Assets <sub>f,t-1</sub>	$0.087^{*}$	$0.578^{*}$	-0.014	0.067	0.162***		
	(0.049)	(0.321)	(0.031)	(0.048)	(0.037)		
Labor productivity <sub>f,t-1</sub>	-0.204***	-0.664**	-0.109**	$-0.192^{***}$	0.259***		
37	(0.068)	(0.332)	(0.053)	(0.066)	(0.053)		
Observations	805013	805013	805013	805013	805013		
# Firms	17154	17154	17154	17154	17154		
Firm FE	Yes	Yes	Yes	Yes	No		
Country-year FE	Yes	Yes	Yes	No	Yes		
Year FE	No	No	No	Yes	No		
Kleibergen-Paap	72.150	4.232		72.198	22.036		

The dependent variable is the variation of exports in market m for firms that stay in the market between t-1 and t. The instrumented variable is  $\Delta Days$  of sales outstanding<sub>f,t</sub> and is defined at the firm-level as the ratio of accounts receivable over sales multiplied by 365. The instrument for the variation of days of sales outstanding is  $\overline{d(DSO,60)}_{f,t}$  which is defined as the sales-weighted average of the 2007 sectoral distance of days of sales outstanding to the 60-days threshold multiplied by a dummy equal to one after 2007. Control variables include Labor productivity<sub>f,t-1</sub> (value added over the number of employees),  $log(Total\ Assets)_{f,t-1}$  (total assets in logarithm), Long-term  $debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate}_{f,t}$  (sales-weighted average of sectoral sales growth rates). In the Derogations column, the instrumented variable is modified so as to take into account the sectoral derogations to the 60-days rule (see the appendix for a list of the derogations). Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

**Table 9: Alternative units of aggregation.** 

	$\Delta Exports$						
Unit of aggregation:	Firm-y	/ear	Firm		Firm-product-year		
	(1)	(2)	(3)	(4)	(5)	(6)	
$\Delta Days$ of sales outstanding	-0.095*** (0.027)	-0.091*** (0.024)	-0.034** (0.017)	-0.063*** (0.019)	-0.356* (0.191)	-0.310** (0.157)	
Observations	131669	125870	13023	12454	3230309	3230309	
Firm FE	Yes	Yes	No	No	Yes	Yes	
Year FE	Yes	Yes	No	No	No	No	
Country-Product-Year FE	No	No	No	No	Yes	Yes	
Controls	No	Yes	No	Yes	No	Yes	

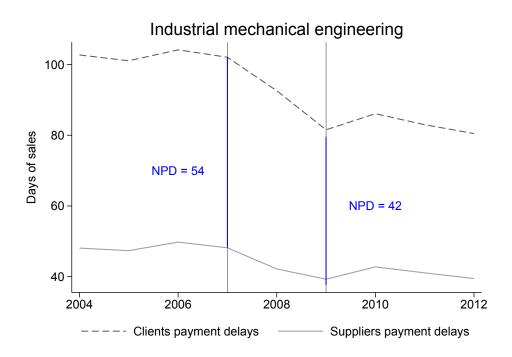
In the first two columns, we sum all the exports at the firm-year level and estimate our baseline specification without the country dimension. The instrumented variable is  $\Delta Days$  of sales outstanding<sub>f,t</sub> and is defined at the firm-level as the ratio of accounts receivable over sales multiplied by 365. The instrument for the variation of days of sales outstanding is  $\overline{d(DSO,60)}_{f,t}$  which is defined as the sales-weighted average of the 2007 sectoral distance of days of sales outstanding to the 60-days threshold multiplied by a dummy equal to one after 2007. Control variables include Labor productivity<sub>f,t-1</sub> (value added over the number of employees),  $log(Total Assets)_{f,t-1}$  (total assets in logarithm),  $Long-term\ debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate}_{f,t}$  (sales-weighted average of sectoral sales growth rates). In the next two columns, we remove the time dimension of the data by calculating the growth rate of firm total exports between 2006 and 2009.  $\Delta Days$  of sales outstanding is defined in this context as the long difference of days of sales outstanding between 2006 and 2009; it is instrumented by  $\overline{d(DSO,60)}_{f,06}$ . Controls include the logarithm of total assets in 2006, the average growth rate between 2006 and 2009 of the sectors in which the firm operates, leverage and labor productivity in 2006. In the last two columns, exports are computed at the level of a firm f, country m, a year t and a product p. A product is defined as a 3-digits code of the Classification of Products by Activity produced by the European Commission. The specification is otherwise identical to the one used in the first two columns. Standard errors are clustered at the firm-level in the first and last two columns and corrected for heteroskedasticity otherwise. Standard errors are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

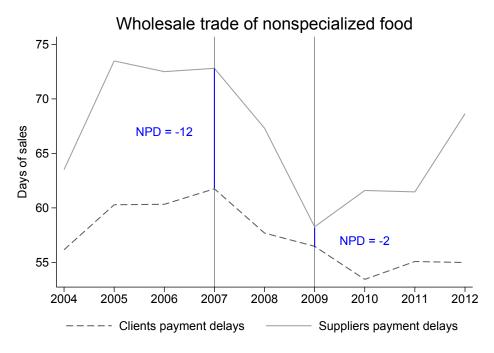
Table 10: Alternative measures of the exposure to the reform.

	$\Delta Exports_{f,m,t}$					
	Baseline	2006 weights	2003-2006 average weights	2007 dummies		
$\Delta Days \ of \ sales \ outstanding_{f,t} \times 10$	-0.037**	-0.044**	-0.041**	-0.041*		
<i>-</i>	(0.018)	(0.022)	(0.020)	(0.023)		
Observations	805013	685235	697337	685263		
# Firms	17154	16250	16342	16251		
Firm FE	Yes	Yes	Yes	Yes		
Country-year FE	Yes	Yes	Yes	Yes		
Kleibergen-Paap	72.2	46.8	55.1	39.5		

The dependent variable is the variation of exports in market m for firms that stay in the market between t-1 and t. The instrumented variable is  $\Delta Days$  of sales outstanding<sub>f,t</sub> and is defined at the firm-level as the ratio of accounts receivable over sales multiplied by 365. Control variables include  $Labor\ productivity_{f,t-1}$  (value added over the number of employees),  $log(Total\ Assets)_{f,t-1}$  (total assets in logarithm),  $Long\ term\ debt\ TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate_{f,t}}$  (sales-weighted average of sectoral sales growth rates). In the Baseline column, the instrument for the variation of days of sales outstanding is defined as the average of the 2007 sectoral distance to the 60-days threshold weighted by the 2007 shares of sales of firm f realized in each sector (multiplied by a dummy equal to one after 2007). In the second (third) column, the weights are defined as the shares of sales of firm f realized in each sector in 2006 (realized on average between 2003 and 2006). In the fourth column, the instrument is defined as the simple average of the 2007 sectoral distance to the 60-days threshold in the sectors in which it operates in 2007 (multiplied by a dummy equal to one after 2007). Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

Figure 5: Effects of the reform on net days outstanding.





Source: Fiscal data.

Interpretation: This graph displays the evolution of days of sales outstanding and days payable outstanding between 2004 and 2012 in the industrial mechanical engineering and wholesale trade of nonspecialized food. Days of sales outstanding are computed as the average ratio of accounts receivable over sales multiplied by 365. Days payable outstanding are computed as the average ratio of accounts payable over purchases. Net days outstanding are defined as DSO minus DPO. Lower net days outstanding means that DSO decreased more than DPO.

Table 11: Net days outstanding and exports.

	$\Delta Net\ days\ outstanding_{f,t}$	$\Delta Exports_{f,m,t}$	$Exit_{f,m,t}$	$Entry_{f,m,t}$
Net days outstanding <sub>f,t</sub> $\times$ 10	-0.022**			
<i>J</i> ,-	(0.009)			
$\Delta Net \ days \ outstanding_{f,t} \times 10$		-0.281**	0.027	-0.012***
<b>J</b> /-		(0.118)	(0.024)	(0.003)
Observations	800678	800678	935604	3461868
# Firms	17025	17025	18517	20036
Firm FE	Yes	Yes	Yes	Yes
Country-year FE	Yes	Yes	Yes	Yes
Kleibergen-Paap		6.6	7.3	62.9

The dependent variables are (in the order of the columns) the variation of net days outstanding (which are defined as the difference between days of sales outstanding and days payable outstanding), the variation of exports in market m for firms that stay in the market between time t and t-1, a dummy indicating whether firm f exits market m at time t and a dummy indicating whether firm f enters market m at time t. The instrument for the variation of days of sales outstanding is the sales-weighted average of 2007 sectoral net days outstanding multiplied by a dummy equal to one after 2007. Control variables include  $Labor\ productivity_{f,t-1}$  (value added over the number of employees),  $log(Total\ Assets)_{f,t-1}$  (total assets in logarithm),  $Long\ term\ debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate}_{f,t}$  (sales-weighted average of sectoral sales growth rates). Regressions include firm and year fixed-effects. Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

Table 12: Effects of net payment delays on the formation of a customer base.

	$\Delta Exports_{f,m,t}$	$\Delta Stable\ customers_{f,m,t}$	$\Delta Customer\ base_{f,m,t}$	New customers <sub>f,m,t</sub>	Lost customers <sub>f,m,t-1</sub>
$\Delta Net \ days \ outstanding_{f,t} \times 10$	-0.281**	-0.101*	-0.179**	-0.129**	0.050*
<i>J</i>	(0.118)	(0.052)	(0.076)	(0.056)	(0.029)
Observations	800678	800678	800678	800678	800678
# Firms	17025	17025	17025	17025	17025
Firm FE	Yes	Yes	Yes	Yes	Yes
Country-year FE	Yes	Yes	Yes	Yes	Yes
Kleibergen-Paap	6.6	6.6	6.6	6.6	6.6

The dependent variables are (in the order of the columns) the variation of exports in market m between time t-1 and t, the variation of exports to customers in market m with whom firm f has a trade relationship at t-1 and t, the variation of exports to customers in market m with whom firm f has a trade relationship only at t-1 or at t, the amount of exports to customers acquired at t (lost at t-1) standardized by the average of total exports in market m of firm f between time t-1 and t. All the dependent variables are defined only for firms that stay in the market between t-1 and t. The instrumented variable is  $\Delta Net\ days\ outstanding_{f,t}$  and is defined as the difference between days of sales outstanding and days payable outstanding. The instrument for the variation of net days outstanding is the sales-weighted average of 2007 sectoral net days outstanding multiplied by a dummy equal to one after 2007. Control variables include  $Labor\ productivity_{f,t-1}$  (value added over the number of employees),  $log(Total\ Assets)_{f,t-1}$  (total assets in logarithm),  $Long\ term\ debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate}_{f,t}$  (sales-weighted average of sectoral sales growth rates). Regressions include firm and year fixed-effects. Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

Table 13: Dynamics of the effects.

	$\Delta Exports_{f,m,t}$			
	Before (03-06)	Treatment (05-08)	After (07-10)	
$\Delta Days \ of \ sales \ outstanding_{f,t} \times 10$	-1.247 (8.198)	-0.048* (0.028)	0.050 (0.033)	
Observations	297103	351322	355672	
# Firms	14761	15361	15214	
Firm FE	Yes	Yes	Yes	
Country-year FE	Yes	Yes	Yes	
Kleibergen-Paap	0.0	28.6	19.1	

The dependent variable is the variation of exports in market m for firms that stay in the market between t-1 and t. The instrumented variable is  $\Delta Days$  of sales outstanding<sub>f,t</sub> and is defined at the firm-level as the ratio of accounts receivable over sales multiplied by 365. Control variables include Labor productivity<sub>f,t-1</sub> (value added over the number of employees),  $log(Total \ Assets)_{f,t-1}$  (total assets in logarithm), Long-term  $debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales}$  growth  $rate_{f,t}$  (sales-weighted average of sectoral sales growth rates). The regression is estimated for different subperiods: 2003-2006, 2005-2008 and 2007-2010. In the first two years of each subperiod, the instrument variable is set to 0. It is equal to  $\overline{d(DSO,60)}_{f,07}$  for the two following years. Standard errors are clustered at the firm-level. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

Table 14: Payment periods and capital structure.

Dependent variables (scaled by <i>Total assets<sub>f,t-1</sub></i> ):	Working capital $_{f,t}$	$Cash_{f,t}$	Credit line <sub>f,t</sub>	$Long$ -term $credit_{f,t}$
$\Delta Days \ of \ sales \ outstanding_{f,t} \times 10$	0.029***	-0.013***	0.013***	-0.003
	(0.005)	(0.004)	(0.003)	(0.002)
$log(Assets)_{f,t-1}$	0.048***	$-0.057^{***}$	0.035***	-0.011**
	(0.013)	(0.009)	(0.007)	(0.005)
Sales growth rate <sub>f,t</sub>	-0.016***	0.019***	$-0.011^{***}$	0.003
	(0.006)	(0.004)	(0.003)	(0.002)
LT debt/Assets <sub>f,t-1</sub>	-0.094***	$-0.055^{***}$	$-0.015^*$	0.471***
	(0.017)	(0.010)	(0.009)	(0.009)
Labor productivity <sub>f,t-1</sub>	0.254***	0.094***	$0.021^*$	-0.005
•	(0.030)	(0.018)	(0.013)	(0.008)
Observations	99593	103092	102813	103012
# Firms	15297	15407	15388	15407
Firm FE	Yes	Yes	Yes	Yes
Year FE	Yes	Yes	Yes	Yes

The dependent variables are (in the order of the columns) the working capital needs of firm f at time t (defined as the sum of inventories, accounts receivable net of accounts payable as well as other operating receivables), cash holdings, drawn credit lines and long-term debt. All the dependent variables are standardized by the lag of total assets. The instrumented variable is  $\Delta Days$  of sales outstanding $_{f,t}$  and is defined at the firm-level as the ratio of accounts receivable over sales multiplied by 365. The instrument for the variation of days of sales outstanding is  $\overline{d(DSO,60)}_{f,t}$  which is defined as the sales-weighted average of the 2007 sectoral distance of days of sales outstanding to the 60-days threshold multiplied by a dummy equal to one after 2007. Control variables include  $Labor\ productivity_{f,t-1}$  (value added over the number of employees),  $log(Total\ Assets)_{f,t-1}$  (total assets in logarithm),  $Long\ term\ debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate_{f,t}}$  (sales-weighted average of sectoral sales growth rates). Regressions include firm and year fixed-effects. Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%

Table 15: Heterogeneity I - Intensity of liquidity constraints

	$\Delta Exports_{f,m,t}$							
	Cash/Assets		Debt/Assets Total		Total s	ales	Volatility	of sales
	≤ P50 (1)	$\geq P50$ (2)	$\leq P50$ (3)	≥ <i>P</i> 50 (4)	≤ <i>P</i> 50 (5)	≥ <i>P</i> 50 (6)	≤ P50 (7)	$\geq P50$ (8)
$\Delta Days \ of \ sales \ outstanding_{f,t} \times 10$	-0.331**	0.019	-0.085	-0.132**	-0.195**	-0.079	-0.118	-0.167**
	(0.139)	(0.058)	(0.125)	(0.059)	(0.095)	(0.073)	(0.086)	(0.084)
Observations	380548	380678	378397	378437	385417	385699	376760	376845
# Firms	8071	8255	7785	8543	10394	7298	7535	7452
Firm FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Country-year FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Kleibergen-Paap	19.5	64.2	15.5	72.6	28.6	46.9	31.4	37.3

The dependent variable is the variation of exports in market m for firms that stay in the market between t-1 and t. The instrumented variable is  $\Delta Days$  of sales outstanding<sub>f,t</sub> and is defined at the firm-level as the ratio of accounts receivable over sales multiplied by 365. Control variables include Labor productivity<sub>f,t-1</sub> (value added over the number of employees),  $log(Total\ Assets)_{f,t-1}$  (total assets in logarithm),  $Long-term\ debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate}_{f,t}$  (sales-weighted average of sectoral sales growth rates). In the first three groups, observations are sorted by the average values between 2003 and 2007 of total sales, ratio of cash to assets and long-term debt over assets. In the last group, observations are sorted by volatility of sales computed as the standard deviation of sales normalized by the average value of sales between 2003 and 2007. Rankings are within country× year (P50 is the median). Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

Table 16: Effects of the policy on domestic sales and sourcing strategies.

	$\Delta Domestic\ turnover_{f,t}$		$\textit{Import share}_{f,t}$
_	(1)	(2)	(3)
$\Delta Days \ of \ sales \ outstanding_{f,t} \times 10$	0.012		
•	(0.009)		
$log(Assets)_{f,t-1}$	-0.073***	-0.095***	-0.019
•	(0.023)	(0.011)	(0.055)
Sales growth rate <sub>f,t</sub>	$0.129^{***}$	0.156***	0.020
<b>3</b> 7	(0.013)	(0.016)	(0.022)
LT debt/Assets <sub>f,t-1</sub>	$0.052^{*}$	0.001	-0.002
	(0.031)	(0.050)	(0.052)
Labor productivity <sub><math>f,t-1</math></sub>	$-0.784^{***}$	$-1.312^{***}$	$0.119^{***}$
	(0.060)	(0.154)	(0.027)
$\Delta Net \ days \ outstanding_{f,t} \times 10$		$-0.145^{***}$	
		(0.036)	
$\Delta Days \ payable \ outstanding_{f,t} \times 10$			-0.008
			(0.017)
Observations	102511	102121	103083
# Firms	15395	15295	15407
Firm FE	Yes	Yes	Yes
Year FE	Yes	Yes	Yes

The dependent variables are the variation of sales in the domestic market in the two first columns and the import share (ratio of imports to total purchases) in the last two columns. The instrumented variable in the first column is  $\Delta Days \ of \ sales \ outstanding_{f,t}$  and is defined at the firm-level as the ratio of accounts receivable over sales multiplied by 365. The instrument for the variation of days of sales outstanding is  $d(DSO,60)_{f,t}$  which is defined as the salesweighted average of the 2007 sectoral distance of days of sales outstanding to the 60-days threshold multiplied by a dummy equal to one after 2007. The instrumented variable in the second column is  $\Delta Net \ days \ outstanding_{ft}$  and is defined as the difference between days of sales outstanding and days payable outstanding. The instrument for the variation of net days outstanding is the sales-weighted average of 2007 sectoral net days outstanding multiplied by a dummy equal to one after 2007. The instrumented variable in the third column is  $\Delta Days$  payable outstanding<sub>f,t</sub> and is defined at the firm-level as the ratio of accounts payables over sales multiplied by 365. The instrument for the variation of days payables outstanding is  $\overline{d(DPO,60)}_{f,t}$  which is defined as the sales-weighted average of the 2007 sectoral distance of days payables outstanding to the 60-days threshold multiplied by a dummy equal to one after 2007. Control variables include Labor productivity $_{f,t-1}$  (value added over the number of employees),  $log(Total\ Assets)_{f,t-1}$  (total assets in logarithm),  $Long\text{-}term\ debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate}_{f,t}$  (sales-weighted average of sectoral sales growth rates). Regressions include firm and year fixed-effects. Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

Table 17: Heterogeneity II - Exposure to the policy.

	$\Delta Exports_{f,m,t}$				
	Import share (2007)		Market shar	re (2007)	
	$\leq P50$ (1)	$\geq P50$ (2)	$\leq P50$ (3)	$\geq P50$ (4)	
$\Delta Days \ of \ sales \ outstanding_{f,t} \times 10$	0.140 (0.139)	-0.135* (0.073)	-0.168** (0.081)	-0.040 (0.082)	
Observations # Firms	91856 2087	487770 10978	393171 11212	393322 7479	
Firm FE Country-year FE Kleibergen-Paap	Yes Yes 10.7	Yes Yes 54.0	Yes Yes 44.5	Yes Yes 32.5	

The dependent variable is the variation of exports in market m for firms that stay in the market between t-1 and t. The instrumented variable is  $\Delta Days$  of sales outstanding<sub>f,t</sub> and is defined at the firm-level as the ratio of accounts receivable over sales multiplied by 365. Control variables include Labor productivity<sub>f,t-1</sub> (value added over the number of employees),  $log(Total\ Assets)_{f,t-1}$  (total assets in logarithm), Long-term  $debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate}_{f,t}$  (sales-weighted average of sectoral sales growth rates).  $\overline{Import\ share}_{s,07}$  is defined as the average import share in sector s in 2007.  $\overline{Import\ share}_{f,07}$  is then computed by taking the average of  $\overline{Import\ share}_{s,07}$  weighted by the sales of firm f in each sector s. The domestic market share is defined as the ratio of domestic sales realized by the firm in its principal sector of activity over the total sum of domestic sales realized in the sector. Rankings are within destination× year (P50 is the median). Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*\*, and \*\*\*\* denote statistical significance at 10, 5 and 1%.

Table 18: Payment periods and product prices.

	All cus	tomers	Existing customers	New customers
	First stage	$\Delta Price_{f,p,m,t}$	$\Delta Price_{f,p,m,t}$	$\Delta Price_{f,p,m,t}$
$\overline{d(DSO,60)}_{f,t} \times 10$	-0.001***			
<i>J</i> ,,	(0.000)			
$log(Assets)_{f,t-1}$	-0.004***	0.011	0.008	0.001
<i>y</i> -	(0.000)	(0.019)	(0.017)	(0.021)
Sales growth rate <sub>f,t</sub>	$0.001^{*}$	0.030***	0.031***	0.030***
- 37	(0.000)	(0.007)	(0.006)	(0.010)
LT debt/Assets <sub>f,t-1</sub>	$0.005^{***}$	-0.014	-0.009	0.011
	(0.001)	(0.030)	(0.028)	(0.036)
Labor productivity <sub>f,t-1</sub>	-0.001	$-0.051^{**}$	$-0.049^{**}$	-0.094**
<b>3</b> /-	(0.002)	(0.023)	(0.020)	(0.037)
$\Delta Days \ of \ sales \ outstanding_{f,t} \times 10$		4.596	3.328	2.766
37		(4.309)	(3.802)	(4.856)
Observations	3821619	3821619	3295705	1549854
# Firms	16693	16693	16334	14769
Firm FE	Yes	Yes	Yes	Yes
Country-product FE	Yes	Yes	Yes	Yes
Year FE	Yes	Yes	Yes	Yes
Kleibergen-Paap		12.7	15.0	16.8

Prices are computed as the ratio of volume to quantity (unit value) at the firm (f), country (m), product (p), and time (t) level. A product is defined as a 8-digits Combined Nomenclature (CN) product code. The main variable is the evolution of prices computed in growth rate (trimmed at the 5% level). In the second and third columns, we compare product prices charged to existing and new customers to the average price charged for the same product in the same country at year t-1. The instrumented variable is  $\Delta Days$  of sales outstanding $f_{t}$  and is defined at the firm-level as the ratio of accounts receivable over sales multiplied by 365. The instrument for the variation of days of sales outstanding is  $\overline{d(DSO,60)}_{f,t}$  which is defined as the sales-weighted average of the 2007 sectoral distance of days of sales outstanding to the 60-days threshold multiplied by a dummy equal to one after 2007. Control variables include  $Labor\ productivity_{f,t-1}$  (value added over the number of employees),  $log(Total\ Assets)_{f,t-1}$  (total assets in logarithm),  $Long\ term\ debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate}_{f,t}$  (sales-weighted average of sectoral sales growth rates). Regressions include firm, year and country-product fixed-effects. Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

Table 19: Heterogeneity III - Costs of customer acquisition.

	$\Delta Exports_{f,m,t}$				
	Rauch classification		Relationshi	p stickiness	
	Homogeneous	Differentiated	< P50	≥ <i>P</i> 50	
$\Delta Days \ of \ sales \ outstanding_{f,t} \times 10$	-0.323	-0.364**	-0.395	-0.304**	
37.	(0.238)	(0.182)	(0.266)	(0.147)	
$log(Assets)_{f,t-1}$	-0.712	$-0.774^{**}$	-0.795	$-0.642^{**}$	
<b>3</b> 7	(0.454)	(0.394)	(0.529)	(0.313)	
Sales growth rate <sub>f,t</sub>	$0.144^{*}$	$0.129^{*}$	0.067	0.218**	
·	(0.075)	(0.077)	(0.064)	(0.089)	
$LT debt/Assets_{f,t-1}$	0.722	$0.762^{*}$	0.658	$0.802^{**}$	
•	(0.440)	(0.395)	(0.490)	(0.345)	
Labor productivity <sub>f,t-1</sub>	-0.132	-0.050	0.412	-0.371	
•	(0.290)	(0.310)	(0.334)	(0.333)	
Observations	965243	2260515	1646416	1583340	
# Firms	14690	19158	15905	15750	
Firm FE	Yes	Yes	Yes	Yes	
Country-Product-year FE	Yes	Yes	Yes	Yes	
Kleibergen-Paap	3.1	6.5	3.3	8.0	

The dependent variable is the variation of exports in market m of product p between t-1 and t. A product is defined by a 3-digits Classification of Products by Activity (CPA) code. For the first two columns, we attribute to each HS8 product a number (0: homogeneous, 1: reference priced, 2: differentiated) in line with its position in the Rauch (1999) classification. For each firm-country-CPA3-year observation, the Rauch code is computed as the average of the Rauch code weighted by exports. Observations are ranked as "Homogeneous" (resp. "Differentiated") if the average Rauch code is below (resp. superior) to the median. In the next two columns, CPA3 products are ranked according to their "relationship stickiness" index Martin, Mejean and Parenti (2018). A higher index signals longer durations of trade relationships for a given product and is associated with higher product market frictions. The instrumented variable is  $\Delta Days$  of sales outstanding<sub>f,t</sub> and is defined at the firm-level as the ratio of accounts receivable over sales multiplied by 365. Control variables include Labor productivity<sub>f,t-1</sub> (value added over the number of employees),  $log(Total \, Assets)_{f,t-1}$  (total assets in logarithm),  $Long-term \, debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales \, growth \, rate_{f,t}}$  (sales-weighted average of sectoral sales growth rates). Regressions include firm and country-product-year fixed-effects. Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.

Table 20: Search costs versus input specificity.

	All customers $_{f,m,t}$	Non-connected customers <sub>f,m,t</sub>	Connected customers <sub>f,m,t</sub>
$\Delta Days \ of \ sales \ outstanding_{f,t} \times 10$	-0.017*	-0.008**	-0.008
<i>J</i> ,-	(0.009)	(0.003)	(0.008)
Observations	721864	721864	721864
# Firms	16840	16840	16840
Firm FE	Yes	Yes	Yes
Country-year FE	Yes	Yes	Yes
Kleibergen-Paap	75.2	75.2	75.2

The dependent variable in the first column is the ratio of exports at time t in market m to the average value of exports between t and t-1. The dependent variable in the second (resp. third) column is the ratio of exports at time t in market m realized with non-connected (resp. connected) customers to the average value of exports between t and t-1. A customer is said to be "connected" it has already traded with a French exporter before time t, and "non-connected" otherwise. The instrumented variable is  $\Delta Days$  of sales outstanding<sub>f,t</sub> and is defined at the firm-level as the ratio of accounts receivable over sales multiplied by 365. Control variables include  $Labor\ productivity_{f,t-1}$  (value added over the number of employees),  $log(Total\ Assets)_{f,t-1}$  (total assets in logarithm),  $Long\ term\ debt/TA_{f,t}$  (ratio of long-term debt to total assets),  $\overline{Sales\ growth\ rate_{f,t}}$  (sales-weighted average of sectoral sales growth rates). Regressions include firm and country-product-year fixed-effects. Standard errors are clustered at the firm-level and are given in parentheses. \*, \*\*, and \*\*\* denote statistical significance at 10, 5 and 1%.