# Loss of a Lending Relationship: Pain or Relief? 

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## Motivation

- The 2007-9 financial crisis exposed the importance of firm-bank relationships
- During the crisis, lending relationships helped firms access credit
- Gobbi and Sette (2015); Bolton, Freixas, Gambacorta and Mistrulli (2016); Beck, Degryse, Haas and van Horen (2017)
- But relationships with severely hit banks were less helpful
- Stressed banks cut lending (Ivashina and Scharfstein, 2010) and raised interest rates (Santos, 2011)
- And due to a stickiness of relationships, firms stuck with bad banks were forced to:
- Lay off staff (Chodorow-Reich, 2014), Cut investment (Carvalho, Ferreira and Matos, 2015), and even shut down (Jiménez, Ongena, Peydró, and Saurina, 2017)
- Theoretical literature explains why switching is costly (information asymmetries)
- Sharpe (1990); Rajan (1992); Von Thadden (2004); Bolton, Freixas, Gambacorta and Mistrulli (2016)
- Hold-up is reduced by transparency among banks (e.g. via credit bureaus)
- Padilla and Pagano (1997); Jappelli and Pagano (2002)


## This paper

- Research question - how large are firms' bank-switching costs? Do banks exploit these switching costs? What causes these switching costs (e.g. shoe-leather costs, lack of bank-bank or bank-firm transparency)?
- We contribute to the literature by providing novel identification and estimation of firms' hold-up and switching costs
- Using an exhaustive credit register from Bank of Lithuania
- Quarterly data (2011 - 2018) on all loans $(190,728)$ between all, including small, firms $(35,905)$ and all banks (12)
- Interest rates, loan amounts, maturities, collaterals, loan types, firms' industries, repayment delays
- Simultaneous closures of two banks in 2013 q1 exogenously forced firms to switch
- A healthy bank left the market (due to its parent's strategic decision to optimize costs)
- A financially distressed bank was shut down (due to the uncovered misreporting of assets)



## Main findings

- Closure of the healthy bank did not affect its customers' borrowing costs
- Closure of the financially distressed bank reduced its customers' borrowing costs by 1.1 percentage point, which immediately converged to the market's average
- Especially large drop ( 3.5 percentage points) for firms lacking other lending relationships
- But smaller for firms with very long (>6 years) relationships


## Outline

- Theoretical framework
- Data, institutional setting and shocks
- Results
- Endogeneity concerns
- Conclusions and contribution to the literature


## Theoretical framework

- Repeated interactions reduce asymmetric information between firms and banks (e.g. Diamond, 1984)
- Firm-bank relationships create interbank information asymmetries
- This leads to an adverse selection of firms willing to switch banks and makes switching costly for good quality firms (Sharpe, 1990; Rajan, 1992; Von Thadden, 2004)

- Whether or not banks exploit these switching costs depends on their concerns about reputation (Sharpe, 1990)
- Financially distressed banks are less likely to care about their reputation (Boot, Greenbaum and Thakor, 1993)


## Data

- Quarterly loan-level data from 2011 Q4 to 2018 Q1 (some info pre-2011)
- Variables: quarter, firm id, bank id, loan id, loan type, industry, loan outstanding amount, interest rate, collateral value, loan initiation date, loan maturity date, indicator of late repayment

| Firms' industry | Manufacturing | Retail/Wholesale | Transportation | Other | Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Number of firms | 3,730 | 9,207 | 4,209 | 18,759 | 35,905 |
| Number of firms without delayed repayments between 2011-2018 | 2,977 | 7,758 | 3,356 | 15,855 | 29,946 |
| Number of firms with delayed repayments between 2011-2018 | 753 | 1,449 | 853 | 2,904 | 5,959 |
| Percentage of firms with delayed repayments between 2011-2018 | 20\% | 16\% | 20\% | 15\% | 17\% |
| Firm size (proxied as total debt to banks), average | 1,633,159 | 818,025 | 912,740 | 1,605,811 | 1,325,397 |
| 25th percentile | 25,162 | 19,720 | 26,341 | 12,200 | 16,492 |
| median | 97,476 | 57,924 | 86,440 | 40,000 | 52,896 |
| 75th percentile | 437,597 | 228,600 | 303,427 | 200,417 | 246,129 |
| Number of firms at the beginning of the sample-2011Q4 | 2,073 | 4,684 | 2,161 | 8,348 | 17,266 |
| Firm size (proxied as total debt to banks) at 2011Q4, average | 1,143,963 | 609,510 | 643,322 | 1,215,557 | 970,929 |
| 25th percentile | 27,239 | 20,273 | 33,819 | 14,771 | 19,028 |
| median | 101,348 | 57,784 | 101,367 | 44,779 | 59,923 |
| 75th percentile | 434,430 | 225,705 | 322,799 | 257,414 | 275,412 |
| Number of firms with a single relationship at 2011Q4* | 1,446 | 3,514 | 1,512 | 6,858 | 13,330 |
| Number of firms with multiple relationships at 2011Q4* | 627 | 1,170 | 649 | 1,490 | 3,936 |
| Number of firms with short (average<6y) relationships at 2011Q4* | 1,267 | 3,054 | 1,499 | 5,933 | 11,753 |
| Number of firms with long (average>6y) relationships at 2011Q4* | 806 | 1,630 | 662 | 2,415 | 5,513 |

## Institutional setting

- Concentrated banking market: 5 (of 12) largest banks were Scandinavian and held $82 \%$ of corporate loans' amount (2011 Q4)
- Firms rely on banks: EUR 16.8 b debt to banks; EUR 3.1 b - stock market capitalization; EUR 1.3 b - publicly traded corporate bonds (2011 Q4)
- Lithuanian economy in 2011 sharply recovered:
- GDP growth of $6 \%$,
- Banks' profits almost reached a record-high pre-crisis level
- Interest rates were declining, following the expansionary monetary policies of the European Central Bank
- Transparency provided by the credit bureau: detailed ten-year-history of firms' current and expired debt contracts.


## Closures of the banks

- The "Healthy bank":
- $8^{\text {th }}$ largest corporate loans' portfolio
- The "Distressed bank":
- $6^{\text {th }}$ largest corporate loans' portfolio

Proportion of each bank's customers with delayed repayments in 2012


## Results: Change of borrowing costs

Average borrowing costs


## Remaining endogeneity concerns



1. Deterioration (or realization) of firms' quality caused the bank's closure and affected the rates

- It should affect rates upwards, not downwards

2. Bank's closure raised doubts about quality of "good firms" and affected their loan rates

- It should affect rates upwards, not downwards so we are underestimating the negative impact

3. Bank's closure made an auditor review assets and stamp firms as "good" and "bad", and this affected their loan rates

- It took 3 weeks after the closure for the auditor to split the firms. Firms that switched within those 3 weeks show the same drop

4. Bank's closure made another bank buy the "good" portfolio, and the pricing strategy of this bank affected rates

- We are looking only at those firms which switched to other banks and not the acquiring bank

5. Bank's closure forced firms to switch but only good firms could switch - this affected the observed average of rates

- We compare only those firms which appear both before and after the closure. Also, we are primarily interested in the good firms anyway, because they are affected by hold-up. We include medium firms for robustness
- Reverse causality between quality and switching does not sound plausible


## Remaining endogeneity concerns


6. Other (shoe-leather) switching costs responsible

- But then bad firms would have been also exploited

7. Other banks required more collateral (or lent with different maturities or loan sizes), and thus could lend cheaper

- The same diff-in-diff analyses for other loan characteristics give no significant results

8. Old loans are driving the results

- Results are significant when using only newly issued loans in every quarter

9. Market concentration changed

- If both the control and the treatment groups are affected by a change in competition equally, it doesn't matter
- According to Klemperer (1987) free (not locked-in) firms, i.e. our treatment group, are affected by competition more. Thus we might underestimate the effect of relationship break-up
Results are robust when using separately leasing contracts and term loans, and the acquiring bank as a control group


## Results: Change of borrowing costs

Average borrowing costs


## Results: Change of borrowing costs



## Results: Change of borrowing costs

## Average borrowing costs



## Do rates really drop? Methodology

## Difference-in-difference

borrowing_costs $_{f, q}=\beta_{0}+\beta_{1} *$ after $_{q}+\beta_{2} * \operatorname{closed}_{f}+\beta_{3} * \operatorname{closed}_{f} * \operatorname{after}_{q}+\varepsilon_{f, q}$

- Where borrowing_costs $f_{f, q}$ is an average interest rate weighted by loan outstanding amounts in quarter $q$ for firm $f$
- $\quad$ after ${ }_{q}$ is a dummy variable equal to 1 if the quarter $q$ is equal to or larger than 2013 q1 and zero otherwise
- $\quad$ closed $_{f}$ is a dummy variable equal to 1 if firm $f$ was in a treatment group, i.e. a customer of the closed bank "Bank 2 ", and zero if firm $f$ was in a control group
borrowing_costs $_{f, q}=\beta_{0}+\beta_{1} *$ after $_{q}+\beta_{2} *$ closed $_{f}+\beta_{3} *$ exclusive $_{f}+\beta_{4} *$ closed $_{f} *$ after $_{q}+\beta_{5} *$ closed $_{f} *$ exclusive $_{f}+\beta_{6} *$ exclusive $_{f} *$ after $_{q}+\beta_{7} *$ closed $_{f} *$ exclusive $_{f} *$ after $_{q}+\varepsilon_{f, q}$
- Where exclusive $_{f}$ is a dummy variable equal to 1 if firm $f$ is a customer of only one bank and zero otherwise


## Do rates really drop? Results

## "Distressed" bank

Dependent variable: borrowing_costs

| after | $\begin{gathered} -0.989 * * * \\ (0.000) \end{gathered}$ |  | $\begin{gathered} -0.787 * * * \\ (0.000) \end{gathered}$ |  | $\begin{gathered} -0.429 * * \\ (0.013) \end{gathered}$ |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| closed | $\begin{gathered} 1.174 * * * \\ (0.000) \end{gathered}$ |  | $\begin{gathered} 0.481 * * * \\ (0.000) \end{gathered}$ |  | $\begin{gathered} 0.510 * * * \\ (0.002) \end{gathered}$ |  |
| exclusive |  |  | $\begin{gathered} 0.158 * * * \\ (0.000) \end{gathered}$ |  | $\begin{gathered} 0.242 * * * \\ (0.000) \end{gathered}$ |  |
| short_term |  |  |  |  | $\begin{gathered} 0.853 * * * \\ (0.000) \end{gathered}$ |  |
| closed x after | $\begin{gathered} -1.420 * * * \\ (0.000) \end{gathered}$ | $\begin{gathered} -1.096 * * * \\ (0.000) \end{gathered}$ | $\begin{gathered} -0.955^{* * *} \\ (0.000) \end{gathered}$ | $\begin{gathered} -0.498^{* * *} \\ (0.000) \end{gathered}$ | $\begin{gathered} -1.209 * * * \\ (0.000) \end{gathered}$ | $\begin{gathered} -0.606 * * * \\ (0.000) \end{gathered}$ |
| after x closed x exclusive |  |  | $\begin{gathered} -2.536^{* * *} \\ (0.001) \end{gathered}$ | $\begin{gathered} -2.978 * * * \\ (0.000) \end{gathered}$ | $\begin{aligned} & -0.722 \\ & (0.511) \end{aligned}$ | $\begin{gathered} -0.312 \\ (0.688) \end{gathered}$ |
| after x closed x exclusive x short_term |  |  |  |  | $\begin{gathered} -2.758 * * \\ (0.038) \end{gathered}$ | $\begin{gathered} -3.685 * * * \\ (0.002) \end{gathered}$ |
| Constant | $\begin{gathered} 4.431 * * * \\ (0.000) \end{gathered}$ | $\begin{gathered} 3.584 * * * \\ (0.000) \end{gathered}$ | $\begin{gathered} 4.325 * * * \\ (0.000) \end{gathered}$ | $\begin{gathered} 3.601 * * * \\ (0.000) \end{gathered}$ | $\begin{gathered} 3.971 * * * \\ (0.000) \end{gathered}$ | $\begin{gathered} 3.652 * * * \\ (0.000) \end{gathered}$ |
| Firm-fixed effects |  | YES |  | YES |  | YES |
| Quarter-fixed effects |  | YES |  | YES |  | YES |
| Number of observations | 232,819 | 232,819 | 232,819 | 232,819 | 232,819 | 232,819 |
| Adjusted R-squared | 0.043 | 0.808 | 0.052 | 0.809 | 0.059 | 0.811 |

P-values in parentheses. Standard errors are clustered multiway within firms and quarters
*** $\mathrm{p}<0.01$, ** $\mathrm{p}<0.05$, * $\mathrm{p}<0.1$

## Do rates really drop? Results

## "Healthy" bank

Dependent variable: borrowing_costs

| $(1 a)$ | $(1 b)$ | $(2 a)$ | $(2 b)$ | $(3 a)$ | $(3 b)$ |
| :--- | :--- | :--- | :--- | :--- | :--- |


| after | $\begin{gathered} -1.026^{* * *} \\ (0.000) \end{gathered}$ |  | $\begin{gathered} -0.849 * * * \\ (0.000) \end{gathered}$ |  | $\begin{gathered} -0.490 * * * \\ (0.005) \end{gathered}$ |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| closed | -0.918*** |  | -0.950*** |  | $-1.082^{* * *}$ |  |
|  | (0.000) |  | (0.000) |  | (0.000) |  |
| exclusive |  |  | 0.123*** |  | 0.175*** |  |
|  |  |  | (0.004) |  | (0.000) |  |
| short_term |  |  |  |  | $\begin{gathered} 0.840 * * * \\ (0.000) \end{gathered}$ |  |
| closed x after | $\begin{gathered} 0.018 \\ (0.899) \end{gathered}$ | $\begin{gathered} 0.106 \\ (0.466) \end{gathered}$ | $\begin{gathered} -0.129 \\ (0.445) \end{gathered}$ | $\begin{gathered} 0.152 \\ (0.370) \end{gathered}$ | $\begin{gathered} -0.392 * * * \\ (0.005) \end{gathered}$ | $\begin{gathered} 0.130 \\ (0.371) \end{gathered}$ |
| after x closed x exclusive |  |  | $\begin{gathered} 0.139 \\ (0.634) \end{gathered}$ | $\begin{gathered} -0.304 \\ (0.292) \end{gathered}$ | $\begin{gathered} 0.089 \\ (0.858) \end{gathered}$ | $\begin{gathered} -0.540 \\ (0.200) \end{gathered}$ |
| after x closed x exclusive x short_term |  |  |  |  | $\begin{gathered} -0.093 \\ (0.886) \end{gathered}$ | $\begin{gathered} 0.378 \\ (0.524) \end{gathered}$ |
| Constant | $\begin{gathered} 4.476 * * * \\ (0.000) \end{gathered}$ | $\begin{gathered} 3.572^{* * *} * \\ (0.000) \end{gathered}$ | $\begin{gathered} 4.394 * * * \\ (0.000) \end{gathered}$ | $\begin{gathered} 3.584 * * * \\ (0.000) \end{gathered}$ | $\begin{gathered} 4.040^{* * *} \\ (0.000) \end{gathered}$ | $\begin{gathered} 3.639 * * * \\ (0.000) \end{gathered}$ |
| Firm-fixed effects |  | YES |  | YES |  | YES |
| Quarter-fixed effects |  | YES |  | YES |  | YES |
| Number of observations | 234,219 | 234,219 | 234,219 | 234,219 | 234,219 | 234,219 |
| Adjusted R-squared | 0.043 | 0.807 | 0.049 | 0.807 | 0.057 | 0.808 |

P -values in parentheses. Standard errors are clustered multiway within firms and quarters
*** $\mathrm{p}<0.01, * * \mathrm{p}<0.05, * \mathrm{p}<0.1$

## Do rates really converge? Methodology

## Loan matching

Firm A:
Exclusive customer of a closed bank

Bank A
(Outside bank for Firm A; Inside bank for Firm B)

$\xrightarrow{\text { Non-switching loan }}$| Firm B: |
| :--- |
| Old customer <br> of Bank A |

Matching procedure:

- Match every forced-switching loan with as many non-switching loans as possible
- Calculate interest rate spread of each pair
- Regress those spreads on a constant and cluster errors at forced-switching loan level


## Do rates really converge? Results

| Subsample | All firms | Nonswitcher with long <br> relationships (>6 years) | Nonswitcher with short <br> relationships ( (<6 years) |
| :--- | :---: | :---: | :---: |
| Year \& quarter | Yes | Yes | Yes |
| Outside bank | Yes | Yes | Yes |
| Repayment troubles last year | Yes | Yes | Yes |
| Total bank debt (+-70\%) | Yes | Yes | Yes |
| Loan type | Yes | Yes | Yes |
| Proportion of loan collateralized (+-70\%) | Yes | Yes | Yes |
| Loan maturity (+-70\%) | Yes | Yes | Yes |
| Loan amount (+-70\%) | Yes | Yes | Yes |
| Prior relationship length (+-70\%) | Yes | Yes | Yes |
| Number of switching loans | 40 | 19 | 19 |
| Number of non-switching loans | 199 | 118 | 75 |
| Number of observations (matched pairs) | 248 | 139 | 99 |
|  | 3.1 | $19.7^{* * *}$ | $-23.5^{* *}$ |
| Spread in basis points | $(8.2)$ | $(8.5)$ | $(10.0)$ |

## Do long-term relationships benefit firms?

## Panel regression

```
interest_rate l,f,b,q
=\alpha+ }\mp@subsup{\beta}{1}{}\timesl\mp@code{ln(quarters_of_relationship}\mp@subsup{f}{f,b,q}{})+\mp@subsup{\beta}{2}{}\times\mp@subsup{ln}{}{2}(quarters_of_relationship f,b,q
+ }\mp@subsup{\beta}{3}{}\times\mp@subsup{\mathrm{ time_to_maturity }}{l,f,b,q}{}+\mp@subsup{\beta}{4}{}\times\mp@subsup{\mathrm{ perc_collateral l,f,b,q}}{}{+}+\mp@subsup{\beta}{5}{}\times\mp@subsup{\mathrm{ loan_size }}{l,f,b,q}{}+\mathrm{ firm
\times quarter FE + firm }\times\mathrm{ bank FE + bank }\times\mathrm{ quarter FE + loantype FE + }\mp@subsup{\epsilon}{l,f,b,q}{l
```

- interest_rate $l_{l, f, b, q}$ is the interest rate charged for the newly issued loan $l$, taken by firm $f$, from bank $b$, in quarter $q$
- quarters_of_relationship $f_{f, b, q}$ is the length of the relationship between firm $f$ and bank $b$ in quarter $q$ measured in quarters
- time_to_maturity $_{l, f, b, q}$ is time to maturity of the issued loan
- perc_collateral $l_{l, f, b, q}$ is the amount of the collateral relative to the size of the loan: collateral/loan_size
- loan_size ${ }_{l, f, b, q}$ is the outstanding amount of the loan
- FE stands for "fixed effects"


## Do long-term relationships benefit firms?

## Panel regression



P-values in parentheses. Standard errors are clustered multiway within firms and quarters
*** $\mathrm{p}<0.01$, ** $\mathrm{p}<0.05$, * $\mathrm{p}<0.1$

## Do long-term relationships benefit firms?

## Panel regression: fitted values



## Conclusion and contribution

- Relationships with healthy banks on average are neither beneficial nor harmful
- We find evidence that relationships with stressed banks can be harmful and difficult to escape
- Closing such banks may help good firms find cheaper credit
- This is explained by switching costs stemming from interbank information asymmetries
- We contribute to the empirical literature on
- switching costs (Ioannidou and Ongena, 2010; Bonfim et al., 2018),
- hold-up (Berger and Udell, 1995; Lopez-Espinosa et al., 2017),
- banks' health (Slovin et al., 1993; Ivashina and Scharfstein, 2010; Santos, 2011)
- Primary contribution: we demonstrate how hold-up costs disappear when a distressed bank is closed (identification + estimation)

