

Digital Payments and Monetary Policy Transmission

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Motivation

- Banks' **market power** is an impediment to **monetary transmission**
 - Central bank \uparrow rates by x b.p. \nrightarrow banks \uparrow deposit rates by x b.p.
 - Reasons: services offered, deposit stickiness, switching costs
- Digitalization makes switching between banks easier:

Question: How do cashless payments change monetary transmission?

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Overview of results

- Empirically, cashless payments (Pix) *reduce* banks' market power
 - Banks' deposit rates *respond more* to policy rate changes
 - Banks' loans flow out *more* after the policy rate increases
- Dynamic banking model to study counterfactuals and channels
 - Monetary policy transmits *more* after Pix
 - Mainly driven by the deposit channel

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Outline

- 1 Institutional setting
- 2 Empirical results
- 3 Structural model

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Deposit market power and deposit channel

- Banks have market power over deposits
 - Services offered, safety, etc
- When policy rate **increases**, banks **increase** deposit rates...
 - ... by **less** than the policy rate change
 - Deposit spreads **increase**
- For banks with **higher** market power deposit spreads **increase more**

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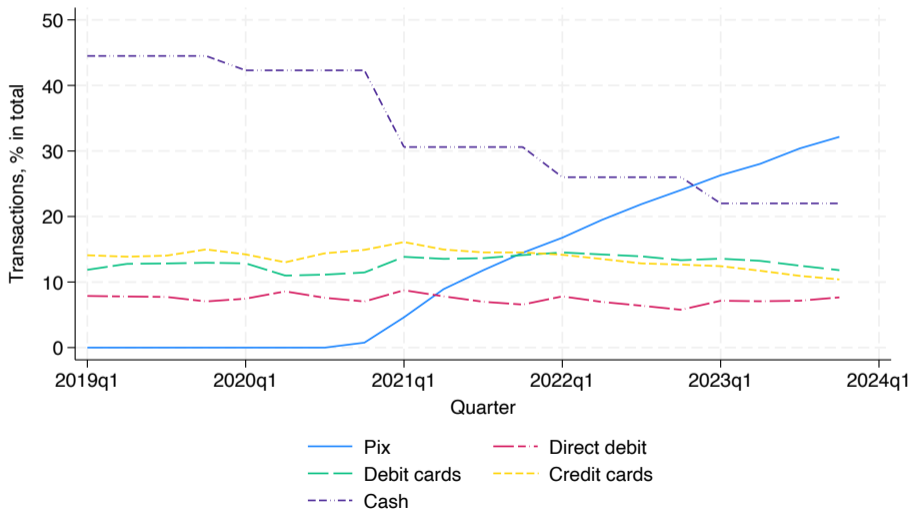
Setting: Pix in Brazil

- Launched by Central Bank of Brazil in November 2020
- Pix became a preferred means of payments
- Covers > 90% of banks and 86% of adult population
- Free and instant transfers and cashless payments, 24/7

*"Pix promotes lower financial costs, digitization of the retail payments market, ... **higher market competition and efficiency** ..."*

– Central Bank of Brazil

Pix vs other payments



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Pix and bank competition

- Pix facilitates transfers and payments among banks
 - Lower switching costs, payment costs
- Less usage of cash \Rightarrow less dependence on physical branches
 - Allows banks with a limited branch network to better compete with larger banks
- Potential to facilitate monetary policy transmission
by **promoting** competition among banks

Outline

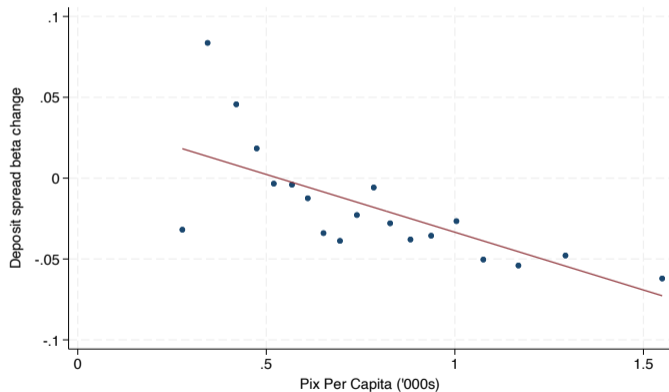
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Data

- **Municipality-level monthly** data on **Pix transactions** (Central Bank of Brazil)
 - Number of transactions, value of transactions
- **Branch-level monthly** data on **banks' balance sheet** (ESTBAN)
 - Deposits, loans, and assets
- **Bank-level** data on **interest rates and equity** (Central Bank of Brazil and Bloomberg)
 - Deposit rates (interest expense), loan rates (interest income), equity returns
- **Municipality-level** demographic and economic data (IBGE)
 - HHI, Census, capital investments, savings, GDP
- Macro variables (IPEA and Central Bank of Brazil)

Deposit spread betas are lower in areas with more Pix usage

$$\Delta DepSpread_{i,t} = \beta_i \Delta Selic_t + \varepsilon_{i,t}, \quad \Delta \beta_i = \beta_{i,after\ 2020m11} - \beta_{i,before\ 2020m11}$$



Within-bank evidence

- Challenges: banks are different and local unobservable demand
- Solution: run within-bank regressions

$$Y_{imt} = \beta MS_t \cdot PixPerCap_{mt} + \gamma X_{imt} + \alpha_{im} + \theta_{it} + \varepsilon_{imt}$$

where $PixPerCap_{mt}$ is value of Pix transactions per capita

Lower spreads, less deposits and loans

$$Y_{imt} = \beta MS_t \cdot PixPerCap_{mt} + \gamma X_{imt} + \alpha_{im} + \theta_{it} + \varepsilon_{imt}$$

	<i>Dependent variable:</i>					
	Deposit spreads		Lending flows		Deposit flows	
	(1)	(2)	(3)	(4)	(5)	(6)
Pix Per Capita × MS	-0.539*** (0.038)	-0.532*** (0.037)	-1.604*** (0.122)	-1.566*** (0.120)	-0.468** (0.228)	-0.456** (0.228)
Branch FE	Yes	No	Yes	No	Yes	No
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes
Bank-Time FE	No	No	No	No	Yes	Yes
Obs.	126,945	126,970	388,323	388,345	365,090	365,113
R ²	0.129	0.127	0.063	0.012	0.066	0.043

Standard errors are clustered at the municipality level

Significance: 10%*, 5%** , 1%***

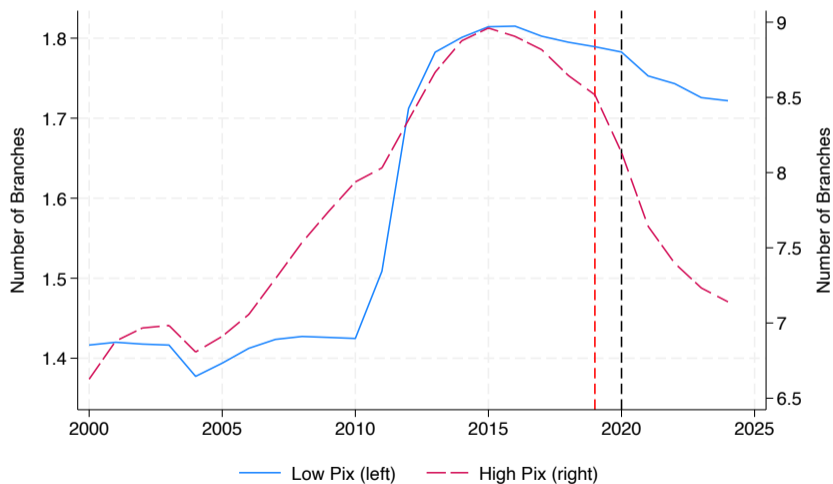
Channels

- Why does Pix increase deposit rates and lead to more outflows?
 - Less reliance on bank branches
 - More competition – potential effects on fees
 - Ease of transfers – more bank accounts (not today)

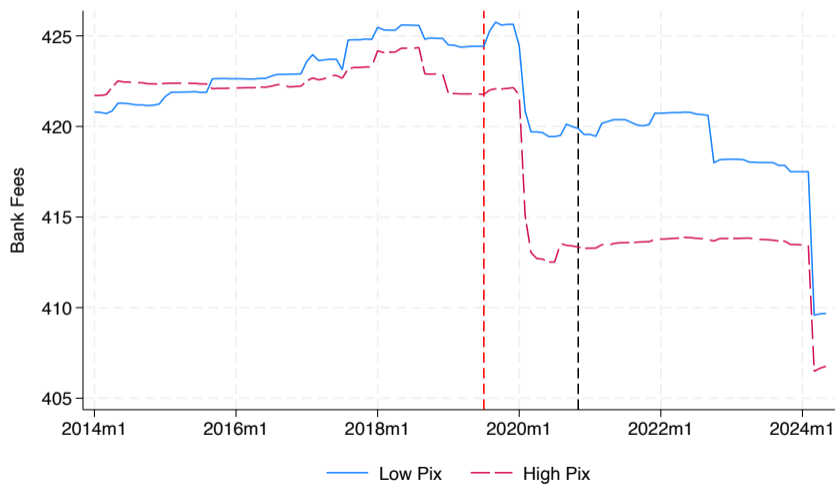
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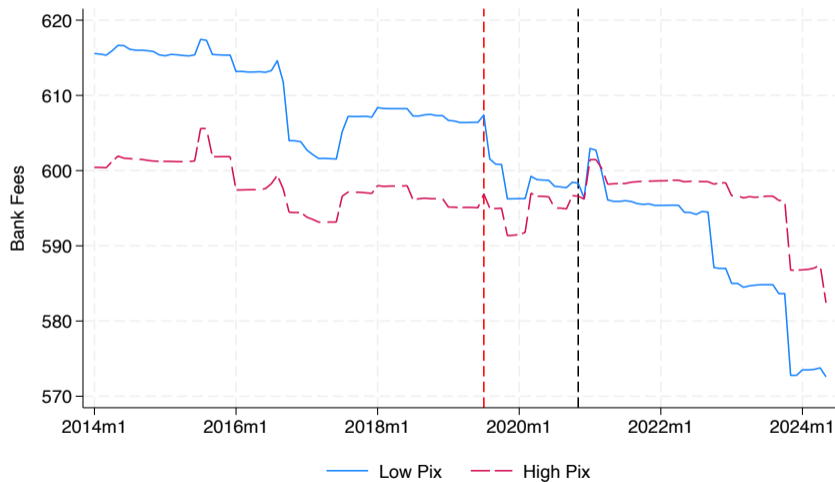
Number of branches declines in high-Pix areas



Payment-related fees decline more in high-Pix areas



Non-payment-related fees increase in high-Pix areas

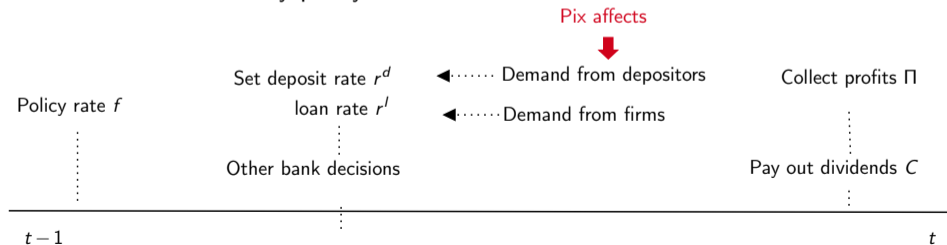


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Infinite-horizon bank industry equilibrium model

- Households: discrete choice on savings
 - Linear utility, Pix affects households' sensitivity to deposit rate
- Firms: discrete choice on financing
- Banks: imperfect competition as in Wang, Whited, Wu and Xiao (2022)
 - Financial frictions such as market power, capital and reserve requirements
- Government: set monetary policy



Households

- Continuum with wealth W , each household endowed with R\$ 1

- Each household i makes saving decision between $J+2$ options:

$$\mathcal{A}^d = \left\{ \underbrace{0}_{\text{Cash}}, 1, \dots, J, \underbrace{J+1}_{\text{Short-term bond}} \right\}$$

- Banks offer Pix after Oct 2020

Households' deposit demand

- Households choose the best investment to maximize their utility:

$$\max_{j \in \mathcal{A}^d} u_{i,j} = \alpha^d r_j^d + \beta^d p_j^d r_j^d + \gamma^d x_j^d + \mu_j^d + \varepsilon_{i,j}^d$$

- α^d – sensitivity of households to rate $r_{j,m}^d$
 - β^d – additional sensitivity to interest rates with Pix
 - μ_j^d – product invariant quality difference (bank FEs)
 - $\varepsilon_{i,j}^d$ – relation-specific shock, with type II extreme value distribution
- IV with fixed costs/assets and loss provisions
 - Aggregate deposit demand

$$D_j(r_j^d | f) = \underbrace{s_j^d(r_j^d | f)}_{\text{Share of bank } j \text{ deposits}} W$$

Banks

- Imperfect competition, J banks
- They choose deposit and loan spreads, join Pix in Nov 2020
- Banks' balance sheet

Assets	Liabilities
Loans	Deposits
Reserves	Wholesale funds
Gov't Securities	Equity

Banks

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	Assets	Liabilities	
Charge-offs, service costs \leftarrow	Loans	Deposits	\Rightarrow Service costs
	Reserves	Wholesale funds	\Rightarrow Quadratic costs
Earn $f_t \leftarrow$	Gov't Securities	Equity	\Rightarrow Fixed ops. costs

Bank profits and maximization problem

- Profits:

$$\begin{aligned} \Pi_t = & I_t - (L_t + B_t)(\eta\delta_t + \phi^\ell) + G_t f_t && \text{Profits from loans and securities} \\ & - (r_t^d + \phi^d)D_t && \text{Expenses from deposits} \\ & - \Phi^N(N_t)N_t && \text{Expenses from wholesale borrowing} \\ & - \psi\bar{E} && \text{Net fixed operating costs} \end{aligned}$$

- Banks make decisions on

- Deposit rate r_t^l and loan rate r_t^d
- Gov't securities G_t , wholesale funds N_t , reserves R_t
- Cash dividend $C_{t+1} \geq 0$

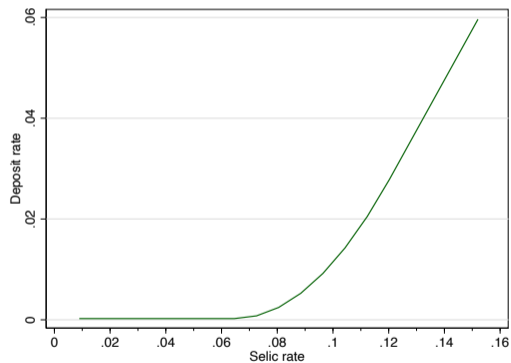
- Maximize expected discounted cash dividends to shareholders

Estimation procedure

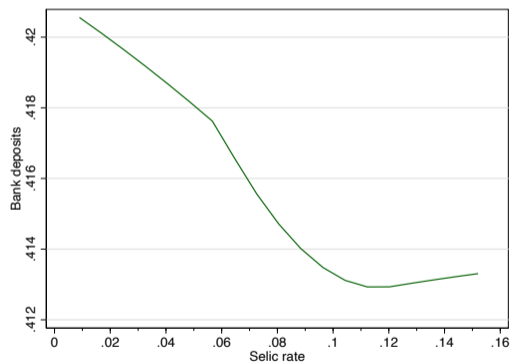
- Step 1: Calibrate parameters
 - Based on banking data and regulations in Brazil
 - Set number of banks, reserve ratio, capital ratio, tax rate, etc.
- Step 2: Estimate deposit and loan demands via BLP
 - Supply shifters: fixed operation costs and loss provisions
 - Key non-rate characteristic: number of branches
- Step 3: Estimate bank parameters via SMD
 - 8 moments directly estimate parameters, 2 free moments for model fits

Baseline deposit rates and deposits

Deposit rate

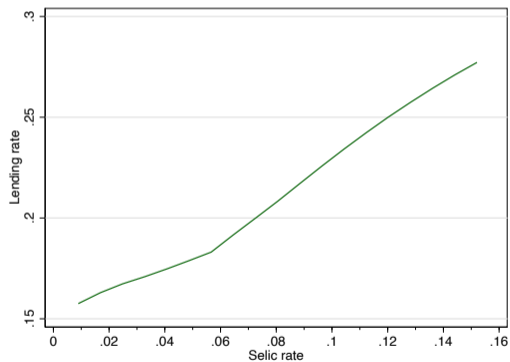


Deposit amount

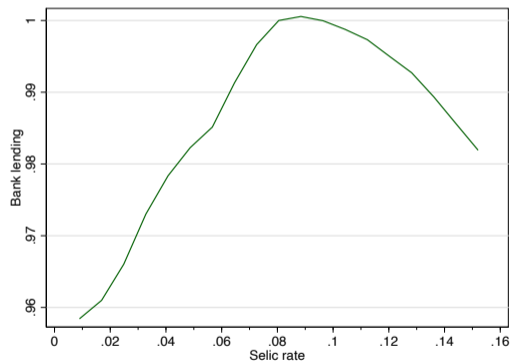


Baseline loan rates and lending

Loan rate

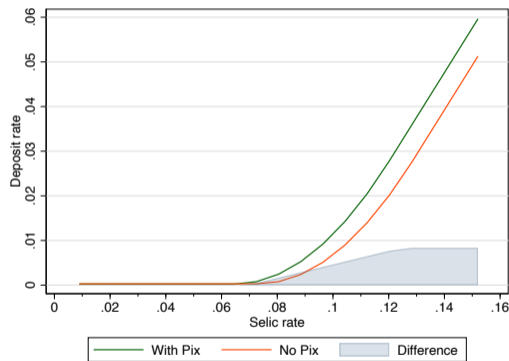


Loan amount

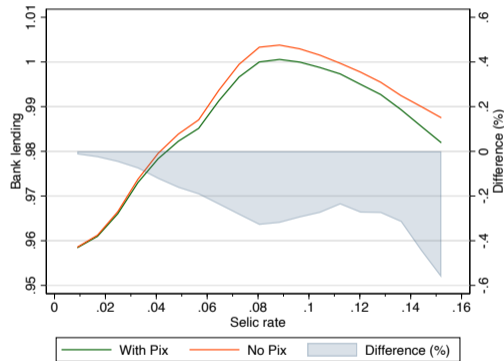


Counterfactual: impact of Pix on deposit rates and lending

Deposit rate

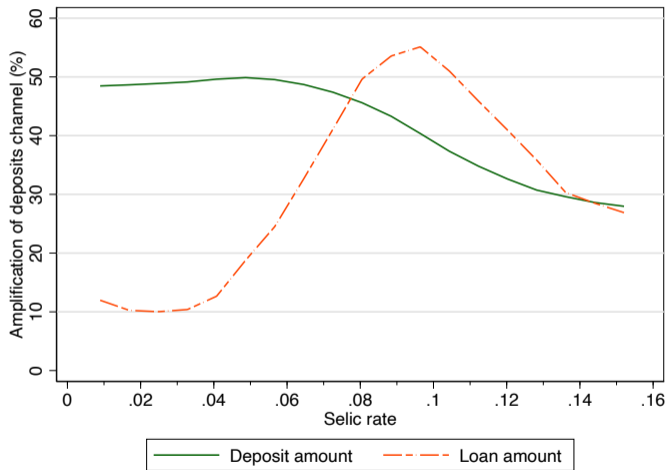


Loan amount



- Banks offer more competitive rates and their lending declines more

Counterfactual: Pix enhances deposit channel effect on deposits and loans



Takeaways

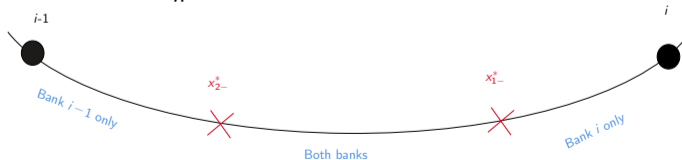
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Appendix

Circular city model and households' banking decision

- n banks located equidistantly in a circular city
- HH utility based on deposit rate r , auxiliary services u , and travel cost $t_d \times$ distance
 - Bank i only: $v = r_i + u_i - t_d x_-$
 - Bank $i-1$ only: $v = r_{i-1} + u_{i-1} - t_d(\frac{1}{n} - x_-)$
 - Deposit α_- at Bank i and rest at Bank $i-1$: $v = \alpha_- r_i + (1 - \alpha_-) r_{i-1} + \max(u_i, u_{i-1}) - t_d \frac{1}{n}$
- Mix region exists if benefits from splitting deposits compensate for the travel costs

$$\frac{1}{n} t_d \leq (2\alpha_- - 1)(r_i - r_{i-1}) + |u_i - u_{i-1}|$$



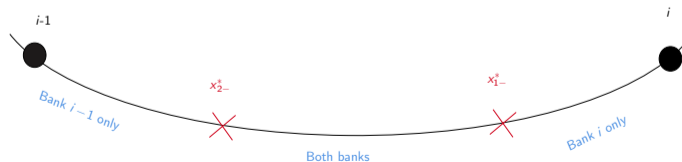
Deposit demand from households

- Sum up deposit demand from left of *Bank_i* and right of *Bank_i*;
- If mix region exists on both side, deposit share is

$$DepShare_i = \overbrace{x_{1-}^* + \alpha_-(x_{2-}^* - x_{1-}^*)}^{\text{Left of bank } i} + \overbrace{x_{1+}^* + \alpha_+(x_{2+}^* - x_{1+}^*)}^{\text{Right of bank } i}$$

- Share of households who will choose bank *i* and a neighboring bank is

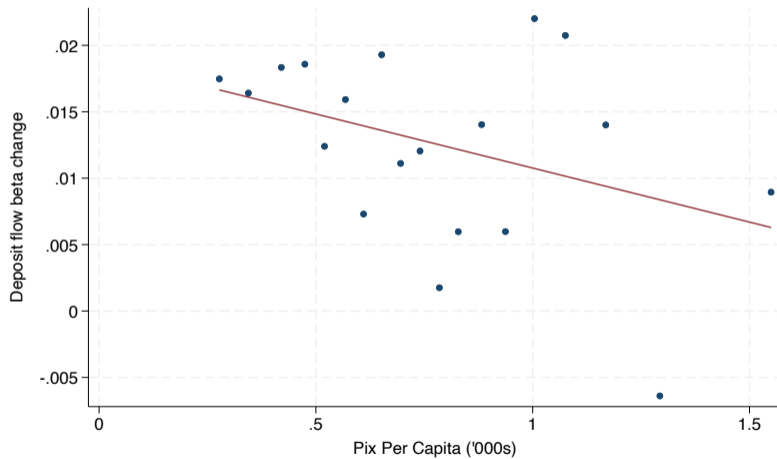
$$MixDepositors_i = (x_{2-}^* - x_{1-}^*) + (x_{2+}^* - x_{1+}^*)$$



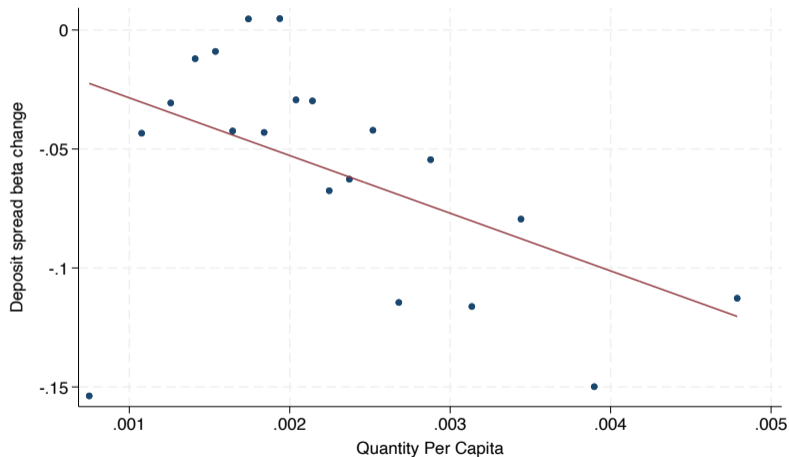
Comparative statics for the simple model

- Reduction in transportation costs: t_d decreases
 - Deposit demand \uparrow for banks with higher benefits of deposit rate and banking services
 - Households are more likely to have two bank accounts
- Equal payment service utility: $u_i = u_{i-1}$
 - More benefits to the bank that originally had **inferior** payment convenience
- Decrease in concentration: n increases
 - Number of banks $\uparrow \implies$ Less costly to travel to nearby banks
 - Choosing both banks is more likely
 - Deposit demand \downarrow for bank i

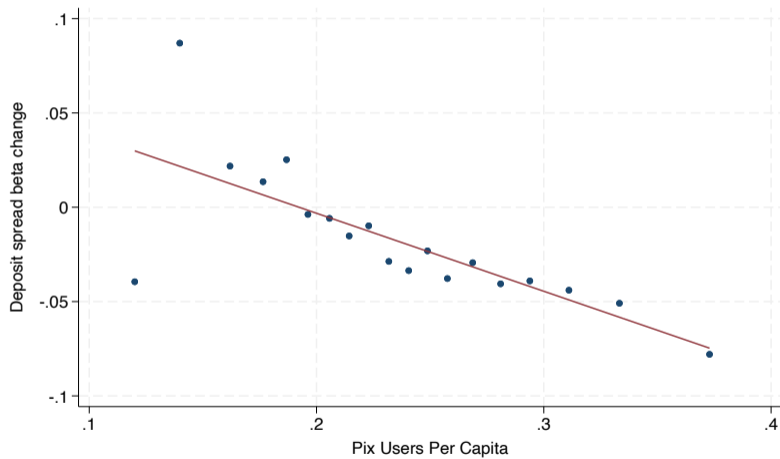
Deposit flow betas



Deposit spread betas: quantity of Pix usage



Deposit spread betas: users of Pix



Monetary shocks

	<i>Dependent variable:</i>					
	Deposit spreads		Lending flows		Deposit flows	
	(1)	(2)	(3)	(4)	(5)	(6)
Pix Per Capita \times MS	-0.54*** (0.04)	-0.36*** (0.04)	-1.60*** (0.12)	-1.66*** (0.14)	-0.47** (0.23)	-0.98*** (0.31)
Method	OLS	IV	OLS	IV	OLS	IV
Branch FE	Yes	Yes	Yes	Yes	Yes	Yes
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes
Bank-Time FE	No	No	No	No	Yes	Yes
Obs.	126,945	126,945	388,323	388,323	365,090	365,090
R^2	0.129		0.063		0.066	
Wald F -stat		5.1		106.9		5,243.8

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Z-scored Pix values

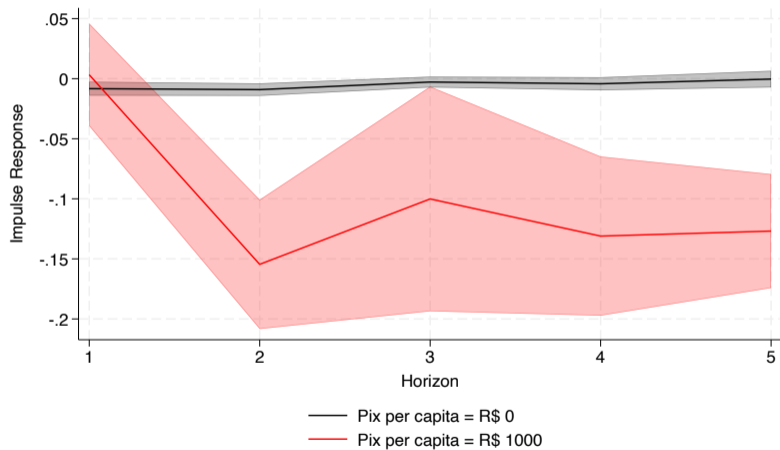
	<i>Dependent variable:</i>					
	Deposit spreads		Lending flows		Deposit flows	
	(1)	(2)	(3)	(4)	(5)	(6)
Pix Per Capita (Z-score) \times MS	-0.17*** (0.01)	-0.17*** (0.01)	-0.50*** (0.04)	-0.49*** (0.04)	-0.15** (0.07)	-0.14** (0.07)
Branch FE	Yes	No	Yes	No	Yes	No
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes
Bank-Time FE	No	No	No	No	Yes	Yes
Obs.	126,945	126,970	388,323	388,345	365,090	365,113
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Persistence and speed of the transmission



BLP Estimation: salaries

Parameter	Symbol	Estimate	Standard error
Sensitivity to deposit rates	α^d	0.037	(0.022)
Sensitivity to deposit rate with Pix	β^d	0.002***	(0.001)
Observations		7,679	
R ²		0.924	

Standard errors are clustered at the bank level

Significance: 10%*, 5%** , 1%***

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BLP Estimation: dummy for Pix

Parameter	Symbol	Estimate	Standard error
Sensitivity to deposit rates	α^d	0.027	(0.019)
Sensitivity to deposit rate with Pix	β^d	0.127***	(0.048)
Observations		6,584	
R ²		0.934	

Standard errors are clustered at the bank level

Significance: 10%*, 5%** , 1%***

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BLP Estimation: state-level

Parameter	Symbol	Estimate	Standard error
Sensitivity to deposit rates	α^d	0.4456***	(0.0563)
Sensitivity to deposit rate with Pix	β^d	0.0961***	(0.0265)
Observations		22,356	
R ²		0.936	

Standard errors are clustered at the bank level

Significance: 10%*, 5%** , 1%***

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