# Borrowing from a Bigtech Platform

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FDIC Bank Research Conference September 29, 2023

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# Bigtech vs Fintech Firms

- $\star$  Bigtech
  - "Technology companies with an established presence in the market for digital services" (Frost et al., 2019; Stultz, 2019)
  - Amazon, Alibaba, Tencent
- Fintech
  - "Specialized firm that challenges a specific product line of banks" (Stultz, 2019)
  - Affirm, CashApp, Robinhood
- Bigtech credit booming globally (Cornelli et al., 2021)
   \$572bn in 2019 vs fintech's \$223bn non-mortgage credit

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- Platforms lend to merchants
  - Payments: PayPal, Stripe, Toast
  - Marketplaces: Amazon, Alibaba, Doordash
- Short-term, uncollateralized, small business loans
  - PayPal: "\$1,000 to \$150,000 for first-time borrowers"
  - Doordash: "typically \$5,000 to \$15,000 or more"
- No (or minimal) conventional credit checks
  - Platforms look at revenues and transactions
  - PayPal: "Your loan is based primarily on your PayPal account history, meaning no credit check is required"
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### This Paper

#### $\star$ Model that explains these patterns

- \* A bigtech platform controls access to a marketplace or payment system
  - Merchants need to pay required fees or sell elsewhere at a loss

- \* Increased fees for borrowing merchants
  - Enforce partial loan repayment
  - \* Banks do not control access to a source of revenues

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# Questions

#### Q: What is the advantage of a platform as a lender?

- A: The platform controls access to a marketplace
- \* Better enforcement of loan repayments

### Q: What are the equilibrium implications of its competition with banks?

- In equilibrium, menu of contracts with different enforcement
- The platform benefits from advantageous screening at the expense of banks

- A: Improves for merchants rationed by banks
- A: Possibly declines when competing with banks
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# Contribution

- $\star\,$  Enforcement as a key advantage of a bigtech platform and its equilibrium implications
  - Not only information, convenience, and regulation
  - cf. Boualam and Yoo (2022), Ghosh, Vallee, and Zeng (2021), He, Huang, and Zhou (2020), Huang (2021), Parlour, Rajan and Zhu (2020)
- \* Superior information may lower the platform's profits
  - In equilibrium, lower surplus extracted from enforcement
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- $\star$  Credit with limited commitment and industrial organization
  - A platform can relax financial constraints
  - cf. Alvarez and Jermann (2000), Kehoe and Levine (1993), Kocherlakota (1996), Ligon, Thomas, and Worrall (2002)
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- Cost of capital: R<sub>D</sub>

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- Revenues off the platform:  $(1-\eta)c_{ heta}$ 
  - Relative revenues:  $\eta \leq 1$
  - Value of the platform for the merchant
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  - Loan due at t = 1
- Between 0 and 1: First production period
  - The merchant produces revenues  $c_{\theta}$
  - Pays fees to the platform (if selling on the marketplace)
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- t = 2: Game ends

# **Financing Frictions**

Set-Up

#### $\star$ Asymmetric information and moral hazard

#### • Asymmetric information

• Merchant is privately informed about her future revenues  $c_{\theta}$ 

 $c_H > c_L$ 

- Credit quality  $p \in [0,1]$ : probability the borrower is high-revenue
- Moral hazard as limited commitment
  - Strategic default if remaining loan balance exceeds future net revenues
  - Low-revenue merchant more likely to default
- Frictions in equilibrium
  - The low-revenue merchant defaults on banks:  $c_L < R_D$
  - The high-revenue merchant does not default on banks if rates are low enough:  $(1 f)c_H > R_D$

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## Repayment Fees and Enforcement

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• The platform charges an additional fee  $f_P$  as partial loan repayment

- Paid when the merchant generates sales, before loan maturity
- $\star$  An optimal response to the risk of strategic default

 $\star$  The platform has an advantage in enforcing repayment

- Based on its control of the marketplace
- Banks cannot exclude merchants from a marketplace
  - Cannot charge repayment fees:  $f_B = 0$

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# Limited Commitment and Incentive Compatibility

IC-θ: The merchant of type θ repays the loan
 \* R<sub>J</sub> ↑ if f<sub>J</sub> ↑

$$\underbrace{R_J - f_J c_{\theta}}_{\text{priving loss balance}} \leq \underbrace{(1 - f) c_{\theta}}_{\text{I}} \quad , \quad J \in \{B, P\}$$

remaining loan balance

future net revenues

 Repayment fees f<sub>P</sub> as optimal solution for the limited-commitment problem

- $\times$  Recover some payment ahead of default
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## Sale Diversion and Incentive Compatibility

- PayPal: We'll monitor accounts for unexpected drops in PayPal sales
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 $\star$  Better enforcement for merchants with high relative revenues  $\eta$ 

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# Benchmark: Borrowing from Banks Only

- Banks charge a break-even rate  $R_B = \frac{R_D}{p}$
- Lend only if high-revenue merchants are willing to repay (IC-H): <sup>R</sup><sub>D</sub> ≤ (1 − f)c<sub>H</sub>
- Banks lend based on credit quality

$$p \geq \frac{R_D}{(1-f)c_H}$$

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- The platform sets incentive-compatible repayment fees (IC- $f_P$ ):  $f_P = \eta f$
- Two options to set *R<sub>P</sub>* as a monopolist
  - Only the good merchant repays (IC-H):  $R_P = (1 2f + \eta)c_H$

$$\mathsf{Revenues} = \underbrace{p(1 - 2f + \eta)c_H + (1 - p)(\eta - f)c_L}_{\mathsf{loan}} + \underbrace{[p2c_H + (1 - p)c_L]f}_{\mathsf{transactions}}$$

• Both merchants repay (IC-L):  $R_P = (1 - 2f + \eta)c_L$ 

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Monopolistic revenues  $\geq \bar{R}$ 

### Conclusion

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- The platform sets incentive-compatible repayment fees (IC- $f_P$ ):  $f_P = \eta f$
- Two options to set  $R_P$  as a monopolist
  - Only the good merchant repays (IC-H):  $R_P = (1 2f + \eta)c_H$

$$\mathsf{Revenues} = \underbrace{p(1 - 2f + \eta)c_H + (1 - p)(\eta - f)c_L}_{\mathsf{loan}} + \underbrace{[p2c_H + (1 - p)c_L]f}_{\mathsf{transactions}}$$

• Both merchants repay (IC-L):  $R_P = (1 - 2f + \eta)c_L$ 

$$\text{Revenues} = \underbrace{(1 - 2f + \eta)c_L}_{\text{loan}} + \underbrace{2[pc_H + (1 - p)c_L]f}_{\text{transactions}}$$

• The platform lends if

Monopolistic revenues  $\geq \bar{R}$ 

- $2c_L \geq \bar{R}$ 
  - IC-L may bind

- $2c_{I} < \bar{R}$ 
  - IC-H always binds

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- Platform and banks compete in the credit market
  - Contemporaneously decide whether to lend and at what rate
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- Contract terms similar to benchmark models
  - Same maturity and repayment fees
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  - Compare social welfare to a benchmark where banks are the only lenders

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Platform profits

# Segmentation by Credit Quality

- $\star$  Only banks lend to high-quality merchants
  - Banks' competitive rate is too low for the platform to beat
  - Welfare  $\sim$
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- - Ambiguous welfare effects



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- ★ Only the platform lends to low-quality merchants
  - Welfare ↑
- ★ Competition for intermediate-quality merchants
  - Ambiguous welfare effects
  - The platform lends even when monopolistic revenues  $< \bar{R}$ (case C)



## Equilibrium Screening

 $\star\,$  The platform benefits from advantageous screening in equilibrium

- Conditional on observables, the platform lends to a better pool of borrowers than banks
- \* The platform extracts rents from banks

 $\star$  Jointly, the platform and banks offer a menu of screening contracts

- The good merchant picks the lender offering the lowest rate
- The bad merchant self-selects into bank loans to avoid enforcement

Banks tighten lending standards

- \* Will deny credit with positive probability
- $\star$  Will increase rates up to  $(1-f)c_H$

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- 1. Internalization of fees f
  - \* Relaxes financial constraints

## 2. Enforcement

- More income can be credibly pledged to the platform
- Lower default risk
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### 3. Advantageous screening

- Extract rents from banks
- Tightens financial constraints

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#### Conclusior

### Borrowing with Competition: Cases

- Cases A and B
  - Monopolistic revenues  $\geq \bar{R}$
- Case B
  - Loans satisfying IC-L are profitable:  $\bar{R} \leq (1 2f + \eta)c_L$
- Case C
  - The platform lends only because of advantageous screening





 $\Delta \mathsf{Welfare} = -\Delta \mathsf{Credit} \ \mathsf{rationing} - \Delta \mathsf{Cost} \ \mathsf{of} \ \mathsf{capital} + \Delta \mathsf{Enforcement}$ 



 $\star$  If R is sufficiently large, welfare declines unambiguously

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 $\Delta \mathsf{Welfare} = -\Delta \mathsf{Credit} \ \mathsf{rationing} - \Delta \mathsf{Cost} \ \mathsf{of} \ \mathsf{capital} + \Delta \mathsf{Enforcement}$ 

- Case A
  - Cost of capital  $\uparrow$  iff  $\bar{R} > R_D$
- Case B
  - Cost of capital  $\uparrow$  iff  $\bar{R} > R_D$
  - Enforcement  $\uparrow / \sim$
- Case C (implies  $\bar{R} > R_D$ )
  - Credit rationing ↑
  - Cost of capital ↑



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- The platform can acquire information at cost c 
  ightarrow 0
  - High signal: *P*(high revenues) ↑
  - Low signal: P(high revenues) = 0
- Information used to cream-skim
  - \* Banks lend less because of winner's curse
  - Smaller advantageous-screening rents
- Information used to extract surplus
  - Higher interest rates after high signal
  - Banks compete more aggressively
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## Concluding Remarks

- $\star\,$  The platform controls access to a marketplace
  - Can enforce partial loan repayment

#### $\star$ Benefits from advantageous screening when competing with banks

- Contracts with different level of enforcement
- \* Negative welfare effects

#### \* Ambiguous value of private information

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#### Conclusion

# Thank You!

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#### The Bank's Objective Function

Profits from borrowing at rate R:

 $L_B(R, m_P, G_P; p) := m_P[pG_P(R)(R - R_D) - (1 - p)R_D] + (1 - m_P)(pR - R_D)$ 

- Platform lends w.p. m<sub>P</sub>
  - Borrower is good w.p. p
    - Borrows from banks and repay if  $R < R_P$ , w.p.  $G_P(R)$
  - Borrower is bad w.p. 1 p
    - Always borrows from banks and never repays
- Platform does not lend w.p.  $1 m_P$ 
  - Both types borrow from banks
  - Only the good type repays

#### The Platform's Objective Function

Profits from borrowing at rate R:

$$L_P(R, m_B, G_B; p) := \begin{cases} l_P^0(R, m_B, G_B; p) & \text{if } R \in ((1-f)c_L, (1-2f+\eta)c_L] \\ l_P^1(R, m_B, G_B; p) & \text{if } R > (1-2f+\eta)c_L. \end{cases}$$

- Bad borrower repays the platform if  $R \leq (1 2f + \eta)c_L$
- Bad borrower does not repay the platform if  $R > (1 2f + \eta)c_L$

$$\star$$
 Discontinuity at  $R=(1-2f+\eta)c_L$ 

## The Platform's Profits when $R \leq (1 - 2f + \eta)c_L$

$$I_P^0(R, m_B, G_B; p) \coloneqq m_B \{ pG_B(R)(R - \bar{R}) + [2pc_H + (1 - p)c_L]f \} + (1 - m_B) \{ R - \bar{R} + 2[pc_H + (1 - p)c_L]f \},$$

- Banks lend w.p. m<sub>B</sub>
  - Borrower is good w.p. p
    - Borrows from the platform and repay if  $R \leq R_B$ , w.p.  $G_B(R)$
    - Pays transaction fees twice
  - Borrower is bad w.p. 1 p
    - Never borrows from the platform
    - Pays transaction fees once
- Banks do not lend w.p. 1 m<sub>B</sub>
  - Both types borrow from the platform
  - Both types repay
  - Both types pay transaction fees twice



#### The Platform's Profits when $R > (1 - 2f + \eta)c_L$

$$\begin{split} I_P^1(R, m_B, G_B; p) &:= m_B p G_B(R) (R - \bar{R}) \\ &+ (1 - m_B) [p R + (1 - p) (\eta - f) c_L - \bar{R}] \\ &+ [2 p c_H + (1 - p) c_L] f, \end{split}$$

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  - Borrower is good w.p. p
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    - Never borrows from the platform
- Banks do not lend w.p.  $1 m_B$ 
  - Both types borrow from the platform
  - Good borrower repays the loan
  - Bad borrower repays only repayment fees  $(\eta f)c_L$
- In both cases
  - Good type pays transaction fees twice
  - Bad type pays transaction fees once



## Definition of Equilibrium

Lending probabilities  $(m_P^*, m_B^*) \in [0, 1]^2$  and rate distributions by the platform and the banks  $F_P^*$  and  $F_B^*$  with supports  $\mathcal{R}_P^*$  and  $\mathcal{R}_B^*$  such that:

- 1. The platform and competitive banks set rates optimally
- 2. Lenders extend credit optimally
- 3. Banks are competitive in the lending market; that is, no lending mechanism  $(F_B, m_B)$  exists such that it improves the bank's and the good merchant's profits.



Case A

- No credit rationing
  - The platform always lends
  - Banks deny credit with positive probability
- Lenders randomize rate offers
  - Banks lend above their competitive rate:
     [R<sub>D</sub>/p, (1 f)c<sub>H</sub>]
  - Platform competes on rates:  $[R_D/p, (1-f)c_H] \cup \{(1-2f+\eta)c_L\}$



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#### Case B

- No credit rationing
  - The platform always lends
  - Banks deny credit with positive probability
- \* The platform may offer rates  $R_P \leq (1 2f + \eta)c_L$ 
  - Bad merchant may repay the platform in full
- More complex price-dispersion equilibrium
  - \* Discontinuity in the platform's objective function



### Case B

- No credit rationing
  - The platform always lends
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#### Case C





Case C



Case C

