The Deposit Franchise and the Risk-Taking Channel of Monetary Policy*

Ricardo Duque Gabriel¹ Ziang Li² Ali Uppal²

¹Federal Reserve Board

²Imperial College London

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*These are our views and not those of the Federal Reserve Board, or the Federal Reserve System.

Motivation

- Monetary policy directly impacts financial stability through bank behaviour
 - The *"risk-taking channel"* is key: changes in interest rates alter banks' incentives to take risk

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 - We identify a new source of heterogeneity linked to banks' deposit franchise

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- But not all banks respond the same way
 - There is substantial *heterogeneity* in how banks adjust lending risk in response to rate changes
 - We identify a new source of heterogeneity linked to banks' deposit franchise
- Why it matters:
 - · Banks' response to monetary policy is crucial for understanding monetary policy transmission
 - · Banks' risk-taking incentives shape how monetary policy and financial stability interact

Our Contributions

- Theory: New mechanism links monetary policy, deposit franchise, and risk-taking
 - Banks with stronger deposit franchise raise deposits rates less when policy rates rise
 - They experience larger increases in deposit spreads and deposit profitability o skin in the game
 - $\Rightarrow~$ Banks with stronger franchise reduce risk-taking more in response to higher rates

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 - \Rightarrow Banks with stronger franchise reduce risk-taking more in response to higher rates
- Empirics: Directly test our mechanism with supervisory loan-level data
 - Identification: monetary policy shocks interacted with *pre-determined deposit betas*
 - Control for credit demand with borrower-time fixed effects
 - ⇒ Banks with lower deposit betas cut risk more aggressively following rate hikes

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Key contribution:

• This paper formalizes and tests a *new mechanism* for the risk-taking channel of monetary policy driven by endogenous bank incentives to protect the deposit franchise

Literature Review

- Risk-Taking Channel of Monetary Policy: Interest Rate $\uparrow \Longrightarrow \mathsf{Risk} ext{-Taking} \downarrow$
 - Rajan 06; Adrian & Shin 11; Maddaloni & Peydro 11; Borio & Zhu 12; Jiménez et al. 14; Ioannidou et al. 15; Dell'Ariccia et al. 17; Delis et al. 17; Altunbas et al. 18; Bonfim & Soares 18; Li et al. 24
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- Deposit Franchise Influences Funding Costs and Lending Behaviour
 - Hannan & Berger 91; Neumark & Sharpe 92; Drechsler et al. 17, 21, 24; Xiao 20; Supera 21; Wang et al. 22; Choi & Rocheteau 23; Yankov 24; Egan et al. 25; Kho 25; Lu and Wu 25; Wang 25
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- Bank Competition and Financial Stability
 - Keeley 90; Demsetz et al. 96; Allen & Gale 00, 04; Boyd & De Nicolo 05; Beck et al. 06;
 Martinez-Miera & Repullo 10; Jimenez et al. 13; Vives 16; Berger et al. 17; Carlson et al. 22
 - <u>Our contribution</u>: Isolate deposit-specific franchise not general competition as a key margin for monetary policy transmission to bank risk





• Deposit Franchise: banks' deposit rates are lower than the policy rate (Drechsler et al., 2021)

$$r_i^D = \beta_i^D r$$

- r is the policy rate, $0 < \beta_i^D < 1$ is the bank's $deposit\ beta$
- Deposit spread $r-r_i^D=(1-\beta_i^D)r>0$



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- r is the policy rate, $0 < \beta_i^D < 1$ is the bank's *deposit beta*
- Deposit spread $r-r_i^D=(1-\beta_i^D)r>0$
- Banks' Problem: Bank i solves the following profit maximization problem

$$\max_{ heta_i} \ p(heta_i) \left[heta_i + r - r_i^D
ight]$$

- Following Allen and Gale (2004), θ_i is the *risk (loan risk premium)* of bank i
- $p(\theta_i)$ is the bank's *survival probability*
- A higher θ_i increases the bank's profit margin $(\theta_i + r r_i^D) \uparrow$, at the cost of higher default risk $(p(\theta_i) \downarrow)$

Predictions

• **Prediction 1 (The Risk-Taking Channel):** banks with a positive deposit franchise (i.e., $\beta_i^D < 1$) take on less risk following increases in the policy rate,

$$\frac{\partial \theta_i}{\partial r} < 0.$$

 $\underline{Intuition:}\ r\uparrow \Longrightarrow \ \mathsf{deposit}\ \mathsf{spread}\ \uparrow \Longrightarrow \ \mathsf{profit}\ \uparrow \Longrightarrow \ \downarrow \ \mathsf{risk}\ \mathsf{to}\ \mathsf{preserve}\ \mathsf{the}\ \mathsf{deposit}\ \mathsf{franchise}$

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<u>Intuition</u>: $r \uparrow \Longrightarrow$ deposit spread $\uparrow \Longrightarrow$ profit $\uparrow \Longrightarrow \downarrow$ risk to preserve the deposit franchise

 Prediction 2 (The Role of Deposit Franchise): banks with lower deposit betas (i.e., less pass-through, stronger franchises) reduce risk more strongly when interest rates increase,

$$\frac{\partial}{\partial (-\beta_i^D)} \left(\frac{\partial \theta_i}{\partial r} \right) < 0.$$

 $\underline{\text{Intuition:}}\ r\uparrow \Longrightarrow \ \text{deposit spread} \uparrow \text{more for low-beta (high-franchise) banks} \implies \text{risk} \downarrow \text{more}$

Data



- Source: U.S. Federal Reserve Y-14 loan-level regulatory data
 - Covers large bank holding companies (BHCs), 2015–2024
 - Captures over two-thirds of all bank C&I lending
 - · Includes detailed information on the individual loans

• Structure:

· Multiple loans per borrower, across banks and time

· Variables of Interest

- · Loan-level: probability of default (PD), loan size, interest rate, collateral, maturity
- · Bank-level: deposits, capital ratio, size, profitability



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- · Loan-level: probability of default (PD), loan size, interest rate, collateral, maturity
- Bank-level: deposits, capital ratio, size, profitability
- Key Feature: Ex ante loan-level risk-taking measured using internal PDs



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$$z_{k,i,t+h} = \alpha_i + \delta_b + \sum_{l=0}^{4} \beta_{h,l} \operatorname{Shock}_{t-l} + \varepsilon_{k,i,t+h}$$
 (1)

- $z_{k,i,t+h}$: ex ante risk (PD) for loan k by bank i
- Shock $_{t-1}$: monetary policy shock (Jarociński & Karadi, 2020)
- α_i: bank fixed effects
- δ_b : borrower fixed effects

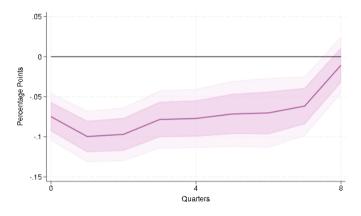
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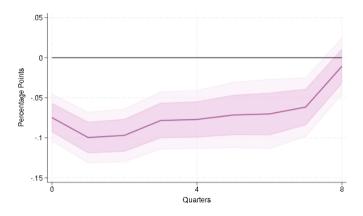
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- Shock $_{t-1}$: monetary policy shock (Jarociński & Karadi, 2020)
- α_i: bank fixed effects
- δ_b : borrower fixed effects
- IRF is the sequence $\{\beta_{h,0}\}_{h=0}^8$ which traces the response of z at t+h to a shock at t

Risk-Taking Declines After A Contractionary Monetary Policy Shock



• Confirm model prediction and consistent with findings in the literature

Risk-Taking Declines After A Contractionary Monetary Policy Shock



- · Confirm model prediction and consistent with findings in the literature
- Innovation relative to empirical literature on the risk-taking channel in the US:
 - (i) Loan-level PDs (ii) Borrower fixed effects (iii) Dynamic effects

Prediction 2: The Role of the Deposit Franchise

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• Empirical requirement: Need a measure of each bank's exposure via deposit franchise

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- Empirical requirement: Need a measure of each bank's exposure via deposit franchise
- Model guidance: This exposure is captured by the deposit beta
- We can compute this!

Computing the Bank-Level Deposit Beta

- We follow the approach in Drechsler et al. (2021) to calculate the deposit beta
- Formally, we estimate the following regression over a pre-period (1984-2014):

$$\Delta \mathsf{DepIntExp}_{\mathit{it}} = \alpha_{\mathit{i}} + \sum_{\tau=0}^{3} \beta_{\mathit{i},\tau}^{\mathit{D}} \Delta \mathsf{FedFunds}_{t-\tau} + \varepsilon_{\mathit{it}}$$

- Δ DepIntExp $_{it}$: change in bank i's deposit interest expense rate from t to t+1
- Δ FedFunds $_t$: change in the Fed funds rate from t to t+1
- α_i : bank fixed effects
- We define the pre-period bank-level deposit beta as the sum of the beta coefficients:

$$\mathsf{DepositBeta}_i = \sum_{\tau=0}^3 \beta_{i,\tau}^D$$

• Pre-period betas important for identification but we also find they predict in-sample betas

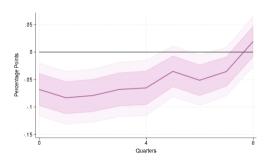
Balance Across High and Low-Deposit Beta Banks

Variable	High beta	Low beta	N (High / Low)	$ \Delta_{IW} $
Bank-level variables				
Tier 1 capital ratio	0.133	0.130	492 / 492	0.104
Total assets (\$M)	566,238	502,107	492 / 492	0.063
Net income/assets	0.006	0.007	492 / 492	0.090
Deposits/assets	0.781	0.805	492 / 492	0.320
Loan-level variables				
Probability of Default	2.41	2.14	2.15M / 2.71M	0.022
Probability of Default ($< 25\%$)	1.38	1.44	2.11M / 2.69M	0.016
Probability of Default ($< 5\%$)	0.80	0.83	1.98M / 2.53M	0.016
Loan Size (\$M)	8.84	8.42	2.15M / 2.71M	0.009
Interest rate	4.06	4.15	1.30M / 2.05M	0.021
Collateralized loan	0.73	0.83	2.15M / 2.71M	0.168
Loan maturity (< 20 years)	5.25	5.58	1.84M / 2.35M	0.075

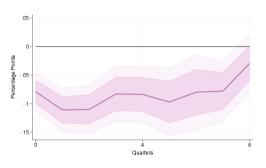
[•] Imbens-Wooldridge normalised difference $|\Delta_{IW}| < 0.25$ shows sufficient comparability

Comparing High- and Low-Beta Banks Risk-Taking Responses

• We re-estimate (1) for the high- and low-beta banks



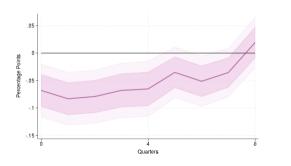
Panel A: High Deposit Beta



Panel B: Low Deposit Beta

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.15 - Quarters

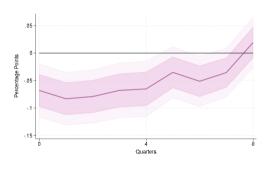
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Panel B: Low Deposit Beta

• Consistent with model prediction, strongest de-risking response to rate hikes comes from banks with the most valuable deposit franchises (low betas) in Panel B

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Panel A: High Deposit Beta

Panel B: Low Deposit Beta

- Consistent with model prediction, strongest de-risking response to rate hikes comes from banks with the most valuable deposit franchises (low betas) in Panel B
- But differences in credit demand across bank groups could confound this comparison

Formally Testing the Role of the Deposit Franchise

• For $h = 0, \dots 8$, we estimate a series of Jordà local projections from 2015 to 2024:

$$z_{k,i,t+h} = \alpha_i + \delta_{b,t} + \sum_{l=0}^{4} \lambda_{h,l} \cdot (\mathsf{Shock}_{t-l} \times \mathsf{DepositBeta}_i) + \varepsilon_{k,i,t+h} \tag{2}$$

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- Identification:
 - Shocks: monetary policy surprises purged of information effects
 - Exposures: pre-determined (1984-2014) variation across banks in deposit beta
 - Credit demand: control for borrower-time fixed effects

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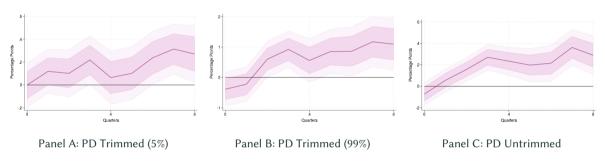
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- Identification:
 - Shocks: monetary policy surprises purged of information effects
 - Exposures: pre-determined (1984-2014) variation across banks in deposit beta
 - Credit demand: control for borrower-time fixed effects
- Prediction: $\lambda_{h,0} > 0$
 - Banks with weaker deposit franchises (higher betas) reduce risk less in response to hikes

Risk-Taking Falls Less for Banks with Higher Deposit Beta

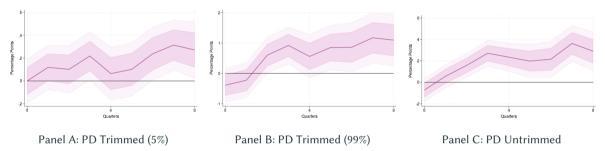






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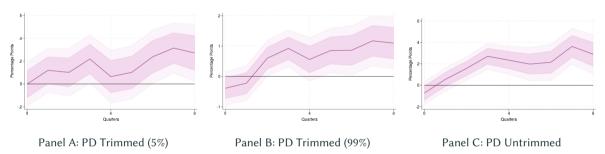




- Consistent with model prediction, after a contractionary monetary policy shock, loan default risk declines less at banks with weaker deposit franchises (higher betas)
- · Result is robust across trimmed and untrimmed samples and new loans only

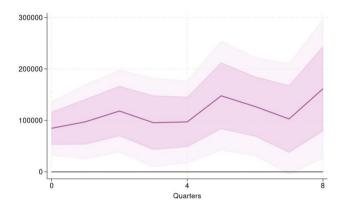
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- Result is robust across trimmed and untrimmed samples and new loans only
- · How much can we trust PDs?

Alternative Measure of Risk-Taking: Ex Post Charge-Offs



- Ex post charge-offs worse for high beta banks (similar to ex ante probability of default)
- Consistent with Beyhaghi et al. (JF, Forthcoming) who verify that bank PDs predict interest rates and ex-post loan performance

Deposit Franchise and Deposit Profitability

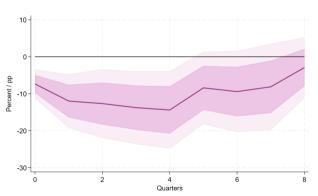
• Do the pre-period deposit betas actually influence deposit profitability?

$$\mathsf{Deposit} \ \mathsf{RoA} \equiv \frac{\mathsf{Profits} \ \mathsf{from} \ \mathsf{Deposits}}{\mathsf{Assets}} = \frac{\mathit{rD} - \mathit{r}^{\mathit{D}} \mathit{D}}{\mathit{A}}$$

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Deposit RoA
$$\equiv \frac{\text{Profits from Deposits}}{\text{Assets}} = \frac{rD - r^DD}{A}$$



• Banks with weaker deposit franchise (high deposit beta) see worse deposit RoA

Alternative Measure of Deposit Franchise (Deposit-HHI) and Risk-Taking

• Are deposit betas the only way to capture the deposit franchise?

$$z_{k,i,t+h} = lpha_i + \delta_{b,t} + \sum_{l=0}^4 \lambda_{h,l} \cdot (\mathsf{Shock}_{t-l} \times \mathsf{HHI}_i) + \varepsilon_{k,i,t+h}$$

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• Banks with stronger deposit franchise (high HHI) reduce risk-taking more

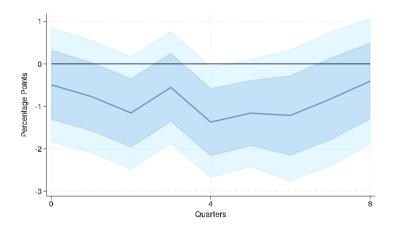
The Role of Bank Capital

- Many existing mechanisms (e.g., search-for-yield, moral hazard) indicate that a bank's
 capital ratio is a key driver of risk-taking responses in the cross-section (Dell'Ariccia et al., 2017)
- Local projection specification as before:

$$z_{k,i,t+h} = \alpha_i + \delta_{b,t} + \sum_{l=0}^4 \gamma_{h,l} \cdot (\mathsf{Shock}_{t-l} \times \mathsf{CapitalRatio}_{i,t-l-1}) + \varepsilon_{k,i,t+h}$$

- Prediction: $\gamma_h < 0$
 - Less capitalized banks face stronger incentives to reach for yield and restore profitability

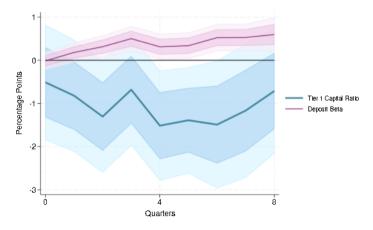
Bank Capital and Risk-Taking



• Consistent with Dell'Ariccia et al. (JF, 2017), after a rate hike, banks with higher capital ratios reduce loan risk more

Deposit Franchise and Bank Capital Mechanisms Co-Exist

$$z_{k,i,t+h} = \alpha_i + \delta_{b,t} + \sum_{l=0}^{4} \lambda_{h,l} \cdot (\mathsf{Shock}_{t-l} \times \mathsf{DepositBeta}_i) + \sum_{l=0}^{4} \gamma_{h,l} \cdot (\mathsf{Shock}_{t-l} \times \mathsf{CapitalRatio}_{i,t-l-1}) + \varepsilon_{k,i,t+h}$$



Portfolio-level Risk Adjustments

• Do banks adjust their overall balance sheet composition in response to monetary policy?

$$\mbox{Risky Asset Share} \equiv \frac{\mbox{Assets Assigned 1250\% Risk Weight}}{\mbox{Assets}}$$

Portfolio-level Risk Adjustments

• Do banks adjust their overall balance sheet composition in response to monetary policy?



 $\bullet\,$ Banks with weaker deposit franchise increase their holdings of the riskiest assets more



Conclusion and Future Work

- We study how deposit franchise shapes the risk-taking channel of monetary policy
 - · Banks with stronger deposit franchises respond to rate hikes by reducing risk more
 - This is due to an increase in deposit profitability, which raises the cost of taking risk
- Empirical analysis with loan-level Y-14 data and internal PDs
 - Robust heterogeneity in risk response across banks with different deposit betas
 - This mechanism co-exists with the capital mechanism highlighted in the existing literature
- Implication:
 - How monetary policy transmits to financial stability depends on banks' deposit franchise

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- · This mechanism co-exists with the capital mechanism highlighted in the existing literature

• Implication:

· How monetary policy transmits to financial stability depends on banks' deposit franchise

• Future Work:

- 1. Decomposing the risk adjustment: closing riskier loans, changing existing loans, or new loans?
- 2. Borrower response (real effects): how do borrowers react (e.g., less risky investments?)
- 3. Robustness checks: many to do!





• We can decompose a bank's profits into

$$p(\theta_i) \left[\theta_i + r - r_i^D \right] = \underbrace{p(\theta_i)\theta_i}_{\text{loan profits}} + \underbrace{p(\theta_i)(r - r_i^D)}_{\text{deposit profits}}$$

Suppose that the bank's problem is repeated for an infinite number of periods. If the bank is
risk-neutral and discounts profits at the risk-free rate r

$$(\text{Deposit Franchise Value})_i = \frac{p(\theta_i)(r - r_i^D)}{r} = p(\theta_i)(1 - \beta_i^D)$$

· Low-beta banks have larger deposit franchise values

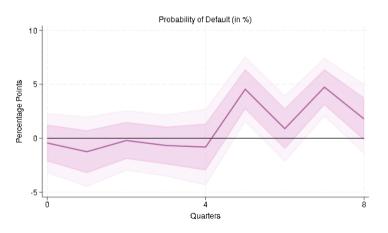
$$\frac{\partial (\mathsf{Deposit \ Franchise \ Value})_i}{\partial (-\beta_i^D)} = \underbrace{-p'(\theta_i)}_{>0} \underbrace{\frac{\partial \theta_i}{\partial \beta_i^D}}_{>0} (1-\beta_i^D) + p(\theta_i) > 0$$

Summary Statistics



	N	Mean	25 th	75 th	Std. Dev.
Loan-level variables					
Probability of Default	4.9M	2.26	0.17	1.38	8.83
Probability of Default ($< 25\%$)	4.8M	1.42	0.17	1.28	2.83
Probability of Default ($< 5\%$)	4.5M	0.82	0.15	1.07	0.94
Loan size (\$M)	4.9M	8.60	0	5.52	30.64
Interest rate	3.4M	4.11	2.63	5.20	2.88
Collateralized loan	4.9M	0.78	1	1	0.41
Loan maturity (< 20 years)	4.2M	5.43	3.35	6.99	3.18
Bank-level variables					
Tier 1 capital ratio	984	0.13	0.11	0.14	0.03
Equity/assets	984	0.11	0.09	0.12	0.02
Total assets (\$M)	984	534,173	151,148	466,138	714,751





• Results are qualitatively similar to using all loans but noisier due to reduced sample size

Determinants of Probability of Default



Independent Variable: Probability of Default

	(1)	(2)	(3)	(4)
Interest Rate	0.066***	0.066***	0.109***	0.108***
	(0.010)	(0.011)	(0.015)	(0.016)
Loan Size (\$M)	-0.002***	-0.002***	-0.002***	-0.002***
	(0.000)	(0.000)	(0.000)	(0.000)
Collateralized Loan	0.354***	0.368***	0.362***	0.377***
	(0.062)	(0.059)	(0.057)	(0.049)
Loan Maturity (< 20 years)	-0.010*	-0.007	-0.004	-0.001
	(0.005)	(0.005)	(0.005)	(0.005)
Constant	0.437***	0.415***	0.220***	0.197***
	(0.071)	(0.066)	(0.072)	(0.064)
Bank FE	No	Yes	No	Yes
Time FE	No	No	Yes	Yes
Observations	2,563,231	2,563,231	2,563,231	2,563,231
R-squared	0.053	0.089	0.078	0.116