Introduction	Setting	Funding Choice	Model	Conclusion
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Natural Bank Reliance ESM-EUI-CEPR Conference

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Introduction	Setting 000	Funding Choice	Model 000	Conclusion 000

Motivation



Introduction	Setting	Funding Choice	Model	Conclusion
○●○○	000		000	000

Different Types of Borrowers

Distribution of employment by firm size

40% US EA 5% 0% From 0 From From From From From From From 50000 to 9 10 to 20 to 50 to 300 to 1000 to 5000 to 10000 and 19 49 299 999 4999 9999 to more 49999

(Percent of total employment)

Introduction	Setting	Funding Choice	Model	Conclusion
0000	000	0000000	000	000

Paper in a Nutshell

Research Question: Analyze firms' funding choice between bank loans and bond funding in the euro area (EA) vs the US.

Approach:

- Empirical: Collect a unique data set of firms funding choices.
- Theoretical: Compute counterfactuals using a theoretical model.

Results:

- Higher utilization of bank funding in the EA is driven by (i) permanent structural differences and (ii) different financial market settings.
- If EA firms had access to a financial market similar to the US, their bank funding share would remain significantly higher due to different firm characteristics.

Implications:

- Bank funding will remain central in the EA, a phenomenon which I label "Natural Bank Reliance."
- Efforts to improve banks' access to capital markets (e.g., securitization) are key.

Introduction 000●	Setting 000	Funding Choice	Model 000	Conclusion

Literature and Contribution

Contribution:

- First data set that covers (to a large degree) smaller firms, so far, analyses of bank vs. bond debt funding choices in the euro area have mostly been based mainly on public firms (e.g., Darmouni, Giesecke, and Rodnyansky 2019; Darmouni and Papoutsi 2020).
- First counterfactual estimation of funding choice in the euro area.
- Informs the policy discussion on the EU's Capital Market Union project and provides insights for EA banks.

Closest papers:

- Allen, Bartiloro, Gu, and Kowalewski (2018).
- De Fiore and Uhlig (2011, 2015).

Introduction	Setting ●OO	Funding Choice	Model 000	Conclusion 000

Data

I compile a unique dataset by combining firm data from Orbis (BvD) with bond data from Refinitiv which covers the euro area and the US.

- Balance sheet data for 1.23 million firms.
- Data on more than 300'000 bond issues, corrected for
 - prepayments,
 - option executions,
 - defaults.
- Datasets need to be matched (matched via LEI, Name, Industry).
- Time period: 2010 before Covid.
- Key variables: bond funding share / loan funding share.
- Add information on each firm's primary bank to assess whether small firms tend to be served more by small banks.

Introduction	Setting ○●○	Funding Choice	Model 000	Conclusion 000

Data Coverage





Introduction	Setting ○○●	Funding Choice	Model 000	Conclusion 000

Bond Funding Share



Figure: Coverage comparison

Drivers of Funding Choice

Firm-specific factors and financial market structure:

Firm-specific factors:

- Firm size.
- Fixed asset share.
- Control for past performance and capital market structure.

Financial market structure is independent of firm characteristics (e.g., market liquidity, disclosure and compliance requirements, local financial regulation).

Introduction	Setting 000	Funding Choice	Model 000	Conclusion 000

What Determines Funding Choices? Motivation

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	(1)	(2)
	Bond share	Bond share
Size (Total assets)	0.5535***	
	(7.7146)	
Size (Employees)		0.1579***
		(2.7004)
Fixed assets	0.0070***	0.0080***
	(21.5361)	(17.8216)
Profitability	-0.0373	-0.0460
	(-1.3539)	(-1.3223)
1	0.0010	0.0000
Leverage	-0.0010	-0.0000
	(-0.3383)	(-0.0055)
Observations	2'492'759	2'492'759
R ²	0.1424	0.0764
Fixed Effects	year	year

***, **, and * shows significance at a 1, 5, and 10% level, respectively.

Regressions include standard errors corrected for clustering at frm-level. Fixed assets refers to the share of fixed assets in total assets, shown as a percent. Total assets is in euro millions. Employees is measured in thousands. Profitability refers to return or assets. Leverage refers to debregoidy, i-clastia in parentheses.

- \uparrow Firm size \Rightarrow \uparrow bond funding
- \uparrow Fixed assets \Rightarrow \uparrow bond funding
- \uparrow Information asymmetries \Rightarrow \uparrow advantage of relationship banking

Introduction	Setting	Funding Choice	Model	Conclusion
0000	000	00●0000	000	000

Firm Size



Figure: Bond funding share across the firm size distribution

Prevalence of savings banks

Firm Size and Modelling Choice

Firm size is the most important determinant of a firm's funding choice.

- The firm size distribution (FSD) is a structural feature of the economy.
- According to Angelini and Generale (2008), in OECD economies, financial constraints have no impact on the aggregate FSD.
- The FSD is strongly shaped by *nonfinancial* factors:
 - Size-based regulation (Garicano, Lelarge, and Van Reenen, 2016).
 - Antitrust laws (Philippon and Gutierrez, 2018; Covarrubias, Gutiérrez, and Philippon, 2020; Grullon, Larkin, and Michaely, 2019).
 - Prevalence of certain industries (Beck et al., 2008).
- Across periods of low and ample credit, the firm size distribution is unchanged.

Introduction	Setting 000	Funding Choice	Model 000	Conclusion 000

Fixed Asset Share and Industry

Industry	Avg. Firm Size	Avg. Bond Share
Water & Waste Management	210	28%
Professional Services	206	11%

Introduction	Setting	Funding Choice	Model	Conclusion
0000	000	00000●0		000

Fixed Asset Share and Industry

Industry	Avg. Firm Size	Avg. Bond Share	Avg. Fixed Assets
Water & Waste Management	210	28%	74%
Professional Services	206	11%	57%

Introduction	Setting	Funding Choice	Model	Conclusion
		0000000		

Fixed Asset Share and Modelling Choice

In addition to firm size, **fixed assets** are important determinant of a firm's funding choice:

- Fixed asset share differs by industry, firms rarely change industries.
- Consider also Beck et al. (2008) on the topic of a firm's industry and funding decisions.

Introduction	Setting 000	Funding Choice	Model ●OO	Conclusion 000

Model Intuition

Setting:

- Banks and bond investors compete to provide funding to firms.
- Informational advantage of banks: If a project fails, banks are able to work with the firm on restructuring, while bond holders need to rely on in-court bankruptcy procedures. Restructurings are quicker, preserving firm value.

Main mechanism: Equilibrium depends on firms' size and fixed asset share:

- Banks' capital costs increase in loan size.
- Drawn-out bankruptcy procedures destroy less firm value for firms with more fixed assets (easier to redeploy).

Equilibrium:

- Small firms are exclusively served by banks.
- Firms' bond funding share increases in its size / fixed asset share.
- Model parameters differ between the EA and the US to reflect different financial market settings. Counterfactual is computed using US parameters for the EA.

Details

Introduction	Setting	Funding Choice	Model	Conclusion
0000	000		OOO	000

Model Fit



Figure: Model Fit

Calibration

Introduction 0000	Setting 000	Funding Choice	Model OOO	Conclusion

Counterfactual Funding Choice



Figure: Counterfactural

Introduction 0000	Setting 000	Funding Choice	Model 000	Conclusion ●OO
Conclusion				

If the capital market structure in the euro area is improved (e.g., due to efforts surrounding the capital market union), **euro area firms would still rely heavily on bank funding**.

- The EA bond funding share would still be at least one third lower due to different firm characteristics.
- The increase in market-based financing will mostly come from large firms (-> banks might provide brokerage services).
- However, smaller firms in the euro area will continue to rely on bank funding, highlighting the key role of small banks in funding the euro area economies.
- Instead of firms funding themselves via capital markets, one solution can be originate-to-distribute models in which banks continue to originate SME loans but sell and securitize them afterwards via capital markets.

Introduction	Setting 000	Funding Choice	Model 000	Conclusion O●●

References I

- Allen, F., Bartiloro, L., Gu, X., Kowalewski, O., 2018. Does economic structure determine financial structure? Journal of International Economics 114, 389–409.
- Angelini, P., Generale, A., 2008. On the evolution of firm size distributions. American Economic Review 98, 426–38.
- Beck, T., Demirguc-Kunt, A., Laeven, L., Levine, R., 2008. Finance, firm size, and growth. Journal of Money, Credit and Banking 40, 1379–1405.
- Becker, B., Josephson, J., 2016. Insolvency resolution and the missing high-yield bond markets. The Review of Financial Studies 29, 2814–2849.
- Caglio, C. R., Darst, R. M., Kalemli-Özcan, Ş., 2021. Risk-taking and monetary policy transmission: Evidence from loans to smes and large firms. NBER Working Paper 28685.
- Covarrubias, M., Gutiérrez, G., Philippon, T., 2020. From good to bad concentration? us industries over the past 30 years. NBER Macroeconomics Annual 34, 1–46.
- Darmouni, O., Giesecke, O., Rodnyansky, A., 2019. The bond lending channel of monetary policy. Available at SSRN 3419235 .
- Darmouni, O., Papoutsi, M., 2020. The rise of bond financing in Europe. Available at SSRN 3748002 .
- De Fiore, F., Uhlig, H., 2011. Bank finance versus bond finance. Journal of Money, Credit and Banking 43, 1399–1421.

Introduction 0000	Setting 000	Funding Choice	Model 000	Conclusion O●●
References II				

- De Fiore, F., Uhlig, H., 2015. Corporate debt structure and the financial crisis. Journal of Money, Credit and Banking 47, 1571–1598.
- Garicano, L., Lelarge, C., Van Reenen, J., 2016. Firm size distortions and the productivity distribution: Evidence from france. American Economic Review 106, 3439–79.
- Grullon, G., Larkin, Y., Michaely, R., 2019. Are us industries becoming more concentrated? Review of Finance 23, 697–743.
- Philippon, T., Gutierrez, G., 2018. How eu markets became more competitive than us markets: A study of institutional drift. CEPR Working Paper No. DP12983.

Appendix

Financing as an obstacle to investment

Availability of financing as a major business obstacle (Share of firms reporting)



Sources: EIB Investment Survey, 2023.

go back

Data Collection - Issuance Through Subsidiaries

Which legal entity issues a bond?

- Many firms issue bonds through subsidiaries.
- These subsidiaries often publish no financial accounts.
- Headquarters include provisions for guarantees for bond-issuing subsidiaries.

Treatment of subsidiaries:

- Collect data on intra-group ownership relationships.
- Roll-up bond debt to the majority-owner (50%+).
- Drop all majority-owned subsidiaries from the data to avoid double-counting.
- In line with Caglio, Darst, and Kalemli-Özcan (2021) for loans in the United States.

Bond Coverage

Figure: Bond data vs. aggregate debt securities



back to presentation

Firm Size and Banking Relationships



Figure: Banking relationships across the firm size distribution

Back to presentation

Firm size - Trends?



Figure: Employment share of small firms (below 50 employees)

 \rightarrow This paper considers firm size as exogenous. Back to presentation

Natural Bank Reliance

Model: Firm

 \rightarrow **Model** based on Becker and Josephson (2016) used for the counterfactual analysis considers firm size and fixed assets as **exogenous characteristics** and **incorporates** issues related to **insolvency**.

Firm capital demand: $K(r) = A - B \cdot r$.

Share of fixed assets (firm industry): θ_i .

- The firm's project is successful with a probability of $1 q_i$.
- When the firm is not successful, its value in a restructuring is $(1 \beta)K(r)$, while in a formal bankruptcy procedures it is $(1 \beta \sigma)K(r)$.
- The amount of funding demanded at r^* is called D_i .
- The default probability is defined by: $q_i(D_i, \theta_i) = q_0 + \tau_D \cdot D_i + \tau_\theta \cdot \theta_i$.²

go back

 $^{^{2}\}tau_{D}$ and τ_{θ} are derived from CDS-implied default probabilities and are allowed to differ in the two regions.

Model: Banks

n banks provide intermediation by accepting deposits and providing bank loans L_i .

- Banks have a convex cost function $C(L_i) = c \frac{L_i^2}{2}$.
- If the firm is in distress, the bank may engage in out-of-court restructuring. Restructurings conserve value compared to formal bankruptcy procedures. These gains amount to a share of *σ* of the investment:

$$\sigma_i = \alpha - \tau \cdot \theta_i,\tag{1}$$

- Profit-maximization leads to bank loan supply: $L = \sqrt{\frac{q * \sigma * D * (n-1)}{c}}$.
- Atomistic competition and risk-neutrality imply that bond investors are willing to lend at $r^* = q/(1 q)$, in which q denotes the firm's failure probability.

go back

Equilibrium

- For small firms, banks can offer lower rates than r* and those firms only use bank funding.
- After a cutoff firm size, bond investors become the residual suppliers of funding.
- Cutoff follows from optimal bank loan supply:

$$D^{CutOff} = \frac{q * (n-1) * (\alpha - \tau \cdot \theta)}{c}.$$
 (2)

For firms above the cutoff firm size, the optimal bond share is:

Bond Funding Share(BS) =
$$1 - \frac{L}{D} = 1 - \sqrt{\frac{q * (n-1) * \sigma}{D * c}}$$
. (3)

Equilibrium visually, statistically. go back

Parameter estimation

- The paper aggregates the micro-level data in yearly buckets of 9 size categories and 10 fixed asset categories (resulting in 90 observation of bond funding share per year per region).
- It estimate the model parameters (by minimizing the squared deviation of model equations 3 and 2) for the two regions.
- The estimated values for the United States are $c = 0.077^{***}$, and $\tau = 0.395^{***}$; as well as $c = 0.083^{***}$, and $\tau = -0.058$ for the euro area.
- The scaling parameters are set to n = 10 and $\alpha = .5$ in both regions.

go back

Equilibrium funding choice



Drivers of funding choice: Fixed assets



Figure: Bond funding share across the fixed asset and firm size distribution

