

### Caterina Mendicino (ECB)

Kalin Nikolov (ECB)

Juan Rubio Ramirez (Emory University)

Javier Suarez (CEMFI and CEPR)

Dominik Supera (Wharton School)

Extreme Financial Distress and the Macroeconomy \*

ECB workshop on Monetary Policy and Financial Stability 17 & 18 December 2018

\*The views expressed here are of the authors, not necessarily those of the European Central Bank



## Model

- 3 Calibration and Model Fit
- 4 Bank Risk Taking
- 5 Shocks to Diversifiable Risk
- 6 How important are island shocks?
- 7 ... Non Linearities?
- 8 ...Bank Leverage?
- 9 Policy Insights



### • Firms and Banks defaults:

- High Firms default can occur with or without High Banks default
- Macro-economic outcomes:
  - substantially worse in periods in which the default rate of **both** Firms and Banks is **High**



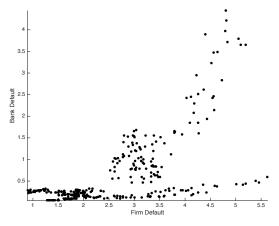
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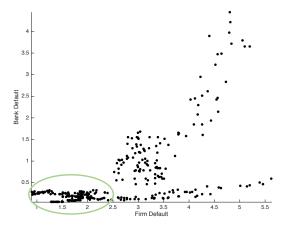
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# Key Facts: Firms and Banks Default Rates - EA (1992-2016)



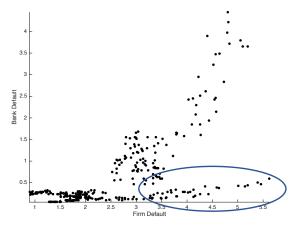
Scatter plot of Moody's expected default frequency within one year: non-financial corporations (Firm default) and banks (Bank default).

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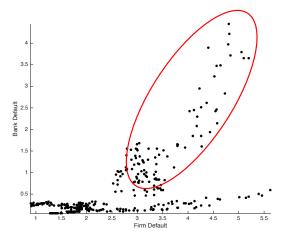
1) Default of both Firms and Banks Low (Normal Times)

# Key Facts: Firms and Banks Default Rates - EA (1992-2016)



2) Firms default High but Banks default Low

# Key Facts:Firms and Banks Default Rates - EA (1992-2016)



3) Default of both Firms and Banks **High** (*extreme financial distress*)

## Key Facts: Macroeconomic Outcomes

### Table: Average Quarterly GDP growth (demeaned)

	High Firm Def.	High Firm Def.	
	Low Bank Def	High Bank Def.	
EA	-0.0466	-0.5842	

High default obs.: above the 90th percentile of the corresponding variable. Quarterly GDP growth de-meaned. Sample: US(1940-2016); EA (1992-2016)

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FR	-0.0718	-0.6605		
IT	-0.0242	-0.5471		
NL	-0.5043	-2.1904		
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# This Paper

Tractable quantitative macro-banking model that embeds:

- a microfounded banking setup: microfounds bank-firm default
- into an otherwise standard macro framework

...to reproduce the following facts:

**1** High Firm default can occur **with** or **without** High Bank default

② Bank credit losses may or may not lead to infrequent but highly disruptive events of financial crises (High Bank and Firm defaults)

The outcome (regimes of defaults & their macro impact) depends on the underlying nature of borrowers riskiness (*diversifiable vs non-diversifiable*).

Key mechanism -> Bank Risk-taking Channel

powerful if banks face an increase in non-diversifiable borrowers risk
amplified by high bank leverage and non-linearities

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A growing number of papers studies

### financial crises and their normative analysis

Bianchi and Mendoza, 2010, 2018; Jeanne and Korinek,2010; Benigno et al., 2013; Boissay, Collard, and Smets 2016; Adrian and Duarte, 2017; Gertler, Kiyotaki, Prestipino, 2017; Elenev, Landvoigt, Nieuwerburgh, 2018;...

 $\Rightarrow$  Framework of analysis that micro-founds the link between Bank and Firm defaults & capture: normal times/recessions vs financial crisis

the long-run effects of capital/leverage requirements

 (e.g. Van Den Heuvel, 2008; Christiano and Ikeda, 2014; Martinez-Miera and Suarez, 2014; Begenau, 2016; Corbae and D'Erasmo, 2017; Begenau and Ladvoigt, 2017; Mendicino, Nikolov, Supera, Suarez, 2018)

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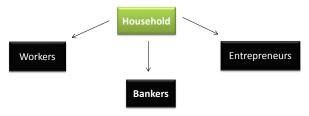
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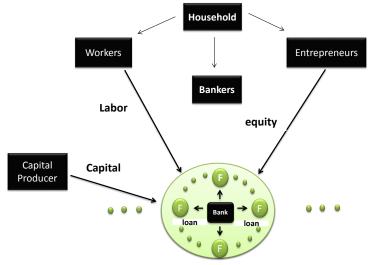
#### Representative household: 3 different types of household members



#### Continuum Island: In each operate one Bank and a continuum of Firms

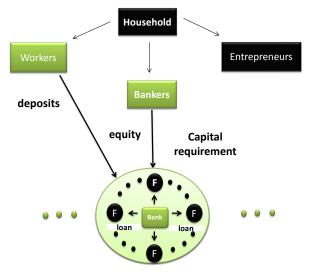


Firms



Firm produces the final good y; pays input of production using equities and loans

Banks

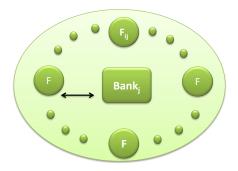


Bank: use equity and (partially insured) deposits to grant loans to firms in the island

## Firm i living on an island j

- borrows from Bank j
- and **defaults** if terminal value of assets  $\omega_i \omega_j [q_{t+1} (1-\delta) k_t + y_{t+1}]$

insufficient to repay bank loans  $R_{f,t}B_{f,t}$ 



18 / 60

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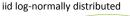
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- : firm-idiosyncratic shock 🛛 📥 diversifiable at bank/island level  $\omega_i$ iid log-normally distributed Bank, December 17, 2018

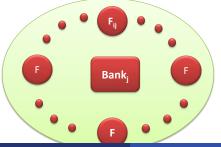
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 $\omega_j$ : island-idiosyncratic shock





NOT diversifiable at bank/island!

 ω<sub>j</sub> = bank-idiosyncratic shock that affects bank returns in a non-linear way

## All borrowers (including Banks)

- can default on their debt obligations
- operate under limited liability

## All external financing

- is subject to CSV frictions
- takes the form of non-recourse uncontingent debt

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## Firms:

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- part of deposits not insured: priced according to the average rather than individual risk profile of the Bank

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 Contracting problem between Bank and Firm (participation constraint of the bank)
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 internalize expected cost of default!

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# Moments Targeted

- Third-order approximate solution
- Quarterly data for the Euro area (1992:1-2016:4)
- GMM

Variable	Data	Model	Variable	Data	Model
MEAN Loans/GDP	2.442	1.7374	STD Loan gr.	1.1965	0.7234
MEAN Loan spr.	1.2443	1.3084	STD Loan spr.	0.6828	0.8217
MEAN Firm def.	2.6469	2.0990	STD Firm def.	1.0989	2.1386
MEAN Bank def.	0.6646	0.5282	STD Bank gr.	0.8438	1.1753
MEAN ROE banks	6.4154	6.2137	STD ROE gr.	4.1273	2.9301
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# Implied Moments: 3 Defaults Regimes

	Frequency	GDP growth	Bank default	Firm default		
	Low Firm and Low Bank Default					
Data	0.844	0.0923	0.4346	2.3480		
Model	0.857	0.0392	0.196	1.4409		
High Firm and Low Bank Default						
Data	0.038	-0.0466	0.4033	4.8500		
Model	0.042	-0.0863	0.814	6.3371		
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High level of defaults is above 90th percentile.

based on 1.000.000 simulations.

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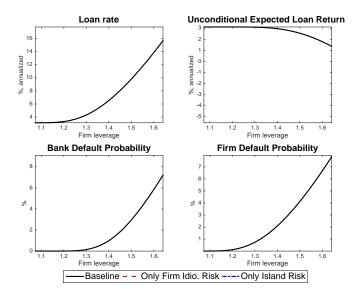
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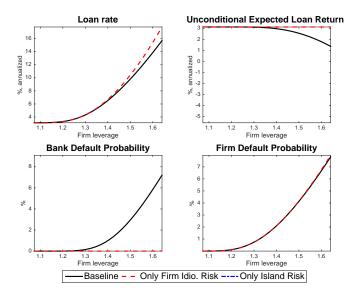
Banks are the center stage of the transmission mechanism of our model

- bank risk taking
- Ø bank funding cost
- bank net worth

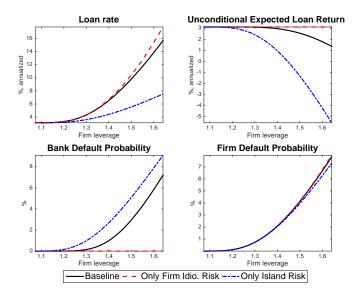
# Bank Loan Pricing: diversifiable vs non-diversifiable Risk



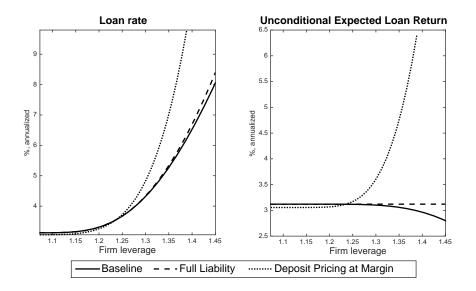
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# Bank Loan Pricing: Limited Liability Bank Risk Pricing



Banks that face **non-diversifiable borrowers risk** 

- ① operate under limited liability
- ② in the absence of risk pricing at the margin
- -> 1+2: are prone to engage in risk taking!

# ₩

#### High Firm and Bank Default



#### Model

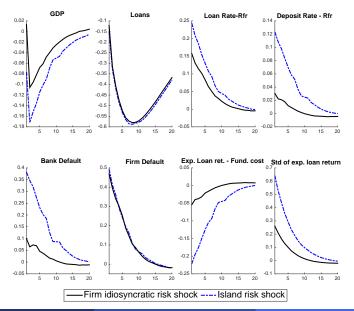
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**Conditional on the same effect on aggregate borrowers riskness**, a shock to **non-diversifiable risk** 

- Increases bank risk taking and banks default...
- ...activates the bank funding cost channel
- and depresses economic activity

by more than a shock to diversifiable risk!

## Shocks to diversifiable and undiversifiable risk



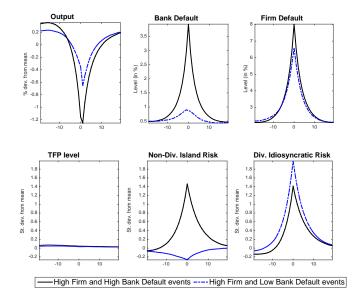


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...instead other regimes can be produced without it!

## Path to Crisis: 3-order



- **High bank leverage** amplifies the transmission of non-diversifiable risk
- **Non-linear** behaviour of bank returns and loan pricing (3 order approx)
  - Conditional on High Firms and Banks defaults the amplification of non-diversifiable risk shocks is strongly amplified (more than 3 times larger drop in GDP)
  - First-order approximate solution fails to match periods of high bank defaults (also with much larger undiversifiable shocks)

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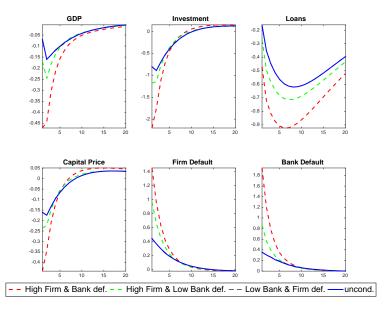
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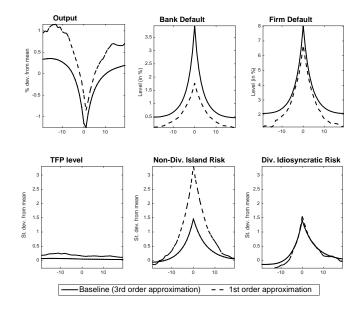
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## Conditional IRFs to Island Risk Shock



## Path to Crisis: 1st order

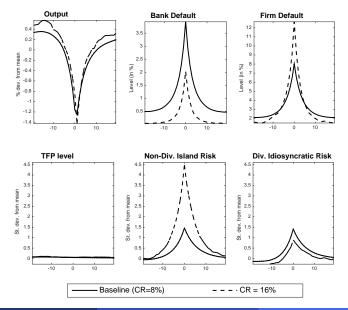




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## Paths to crises and Bank Leverage

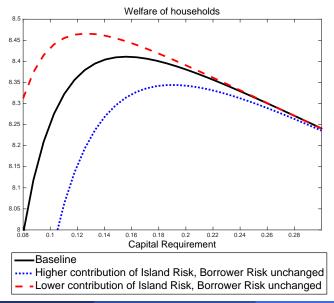




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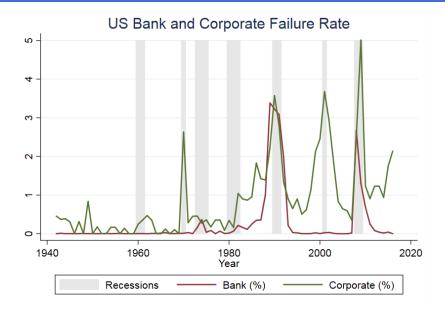
# Optimal Capital Requirement: Welfare



- Bank risk taking key amplification channel of borrowers risk
- Shocks to **non-divesifiable risk** play an important role in generating of *extreme financial distress* (high firms and banks defaults + large GDP drops) when **banks are highly leveraged**
- Non-linearities are key!
- Getting the **correlation of defaults** right (underlying nature of borrowers risk) it is of first order importance when drawing conclusions on the optimal level of capital requirements!

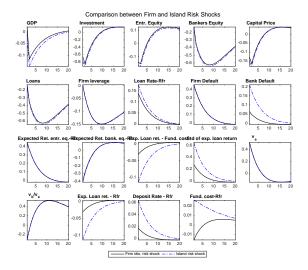
#### BACKGROUND SLIDES

## Paths to crises and Bank Leverage

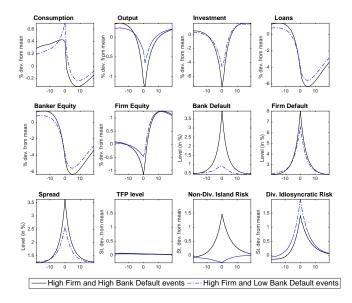


Parameter	Value	
Entrepreneurs' endowment	$\chi_{e}$	0.5514
Bankers' endowment	χь	0.5233
Mean std of firm idio. shock	$\bar{\sigma}_{\omega_i}$	0.4425
Mean std of island idio. shock	$\bar{\sigma}_{\omega_i}$	0.3131
Std TFP shock	$\sigma_{A}$	0.0053
Persistence TFP shock	$ ho_{A}$	0.9868
Std firm idio. risk shock	$\sigma_i$	0.0789
Persistence firm idio. risk shock	$ ho_{\sigma_i}$	0.8322
Std island idio. risk shock	$\sigma_j$	0.084
Persistence island idio. risk shock	$\rho_{\sigma_i}$	0.8401
Mean productivity growth	Ī	1.0965
Capital adjustment cost	$\psi_{k}$	4.9902

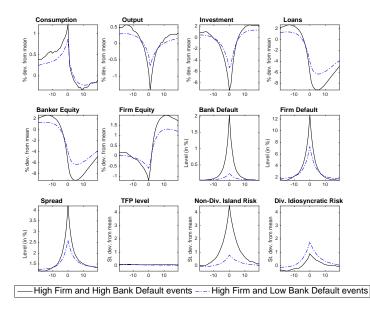
#### IRFs: 1st order



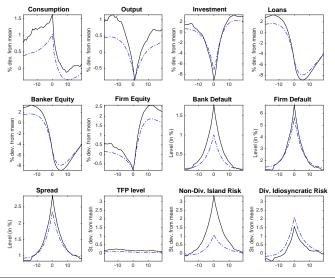
## Path to Crisis: 3-order



## Paths to crises and Bank Leverage

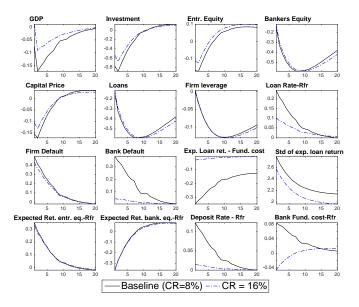


## Path to Crisis: 1st order



-High Firm and High Bank Default events ---- High Firm and Low Bank Default events

## Island idio. risk shock and Bank Leverage



	Moment	Baseline Model	Model	Model	Data		
		$(\phi = .08)$	$(\phi=.105)$	$(\phi = .16)$			
	L	ow Firm and Low	Bank Default				
Mean	GDP growth	0.0392	0.0273	0.0196	0.0923		
Mean	Bank default	0.196	0.0688	0.0067	0.4346		
Mean	Firm default	1.4409	1.3849	1.2584	2.3480		
	High Firm and Low Bank Default						
Mean	GDP growth	-0.0863	-0.103	-0.0805	-0.0466		
Mean	Bank default	0.814	0.326	0.0491	0.4033		
Mean	Firm default	6.3371	6.2944	6.0243	4.8500		
High Firm and High Bank Default							
Mean	GDP growth	-0.4048	-0.2396	-0.1628	-0.5842		
Mean	Bank default	3.8718	1.9106	0.4344	3.2294		
Mean	Firm default	7.6206	7.4513	7.0123	4.6688		

	Moment	Baseline	1st order app.	Data	
Low Firm and Low Bank Default					
Mean	GDP growth	0.0392	0.0213	0.0923	
Mean	Bank default	0.196	0.1034	0.4346	
Mean	Firm default	1.4409	1.3458	2.3480	
High Firm and Low Bank Default					
Mean	GDP growth	-0.0863	-0.102	-0.0466	
Mean	Bank default	0.814	0.5548	0.4033	
Mean	Firm default	6.3371	4.4265	4.8500	
High Firm and High Bank Default					
Mean	GDP growth	-0.4048	-0.1538	-0.5842	
Mean	Bank default	3.8718	0.997	3.2294	
Mean	Firm default	7.6206	4.8921	4.6688	