# Pandemic crises in financial system and liquidity emergency

Julien Idier (Banque de France) Thibaut Piquard (Paris School of Economics)

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Literature Model Data Needs Simulation and results Policy implications Conclusion

Motivation Bad equilibrium and tail risks The role of interconnections

### Introduction

"The assessment of the Governing Council is that we are in a situation now where you have large parts of the euro area in what we call a "bad equilibrium"."

"What we have put in place today is an effective backstop to remove tail risks from the euro area."

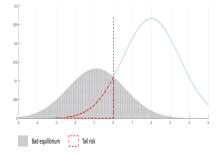
President Draghi speech, 6 September 2012.

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### Introduction

Stylized representation of tail risk and bad equilibrium.



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# Introduction

- If policy makers manage tail risk, they manage extreme events characterized by low probability.
- If the extreme are not characterized by low probability, it may become a bad equilibrium where nothing stays under control since the "new norm" is the materialization of risk.
- In this paper we show how multiple channels of transmission/amplification may give rise to such bad equilibrium in individual bank equity (i.e. affecting probabilities of defaults)

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### Introduction

#### Interconnectedness

- The "Lehman" or "Euro Area sovereign" crises revealed the significance of risks interconnectedness.
- Interconnections are expected
  - 1. between financial institutions
  - 2. between markets (stocks, interbank)
  - 3. between markets and financial institutions

such that one challenge is to try to anticipate all the channels of transmission and amplification.

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### Interplay of multiple channels of contagion

- Exposures to common risk factors or common risk profile
- Cross-equity Holdings
- Market contagion and asset depreciation
- Interbank market and collateralized debt

Need to be analyzed in a joint framework especially for euro area banks characterized by cross border activities within a currency union

In stress-testing exercises, neglecting second round effects lead to underestimation of default probabilities

Solvency models Contagion models Firesales models

# Solvency models

- Merton (1974) for the definition of default
- Gourieroux Heam Montfort (2012) for the cross holding of debt and equity
- Gabrieli Salhakova Vuillemey (2014) was for example a first application of this framework using target 2 data for interconnection proxies.

Solvency models Contagion models Firesales models

### Contagion models

- Price Contagion: DCC models "a la" Engle and Sheppard (2002), Forbes and Rigobon (2001), Billio et al. (2011)
- Microstructure literature: Amihud (2002) as the impact of volume liquidation on prices

Solvency models Contagion models Firesales models

### Firesales models

- Brunnermeier Perdersen (2010) on liquidity/funding spirals
- Greenwood, Landier and Thesmar (2014) on firesales and bank failure amplification

Objective Stylized balance sheet Bank default Bank liquidation Interbank amplification Asset price depreciation

**Objective of the paper:** to combine in a single framework all these contagion channels and measure to what extent first round losses are amplified.

### Key ingredients

- Stylized representation of bank balance sheet
- Bank default mechanisms
- Bank liquidation
- Interbank amplification
- Asset price depreciation

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### Solvency model

Balance sheets in a three banks universe

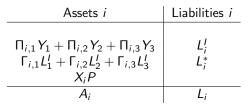


Table : Bank *i* balance sheet

with

- $\Pi_i$  the fractions of equity cross holdings Y
- Γ<sub>i</sub> the fractions of debt cross-holdings L divided in L<sup>1</sup> (interbk, collateralized) and L\* (other liabilities like deposit)
- X<sub>i</sub> the portfolio of non banking assets at price P

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### Bank 3 defaults

Let assume a shock on portfolio prices P becomes P' < P such that bank 3 defaults.

Assets 1	Liabilities 1
$ \begin{array}{c} \Pi_{1,1}Y_{1} + \Pi_{1,2}Y_{2} + \underline{\Pi}_{1,3}Y_{3} \\ \Gamma_{1,2}L_{2}^{\prime} + \underline{\Gamma}_{1,3}L_{3}^{\prime} \\ X_{1}P^{\prime}X_{1}P^{\prime} + \Gamma_{col}(1,3)L_{3}^{\prime}\frac{\mathbb{1}_{\bar{k}-1}}{\bar{k}-1} \end{array} $	L <sup>1</sup> L <sup>*</sup> <sub>1</sub>
$A_1'$	$L_1$

Table : Bank 1 balance sheet after bank 3 default

 Cross-holding equities and interbank debt holdings with bank 3 are lost

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### Bank 3 defaults

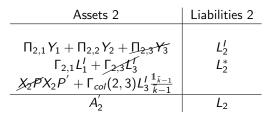


Table : Bank 2 balance sheet after bank 3 default

Similar balance sheet depreciation for bank 2 in the proportion to its exposure to bank 3

Objective Stylized balance sheet Bank default Bank liquidation Interbank amplification Asset price depreciation

### Bank 3 liquidation

Assets 3	Liabilities 3
$ \begin{array}{c} \Pi_{3,1}Y_1 + \Pi_{3,2}Y_2 + \prod_{3,3}Y_3 \\ \Gamma_{3,1}L_1' + \Gamma_{3,2}L_2' \\ \end{matrix} \\ X_3 \mathcal{P} X_3 \mathcal{P}' - (\Gamma_{col}(1,3) + \Gamma_{col}(2,3))L_3' \frac{\mathbb{1}_{\bar{k}-1}}{\bar{k}-1} \end{array} $	L'3 L*3
$A'_3$	$L_3$

Table : Bank 3 balance sheet ready for liquidation

- $\Gamma_{col}$  as the collateral matrix =  $\Gamma$  times a haircut rate,
- ▶ such that bank *i* recovers  $\Gamma_{col}(i,3)L_3^{\prime}\frac{1}{k-1}$ , (if collateral is split equally across different  $\bar{k} 1$  assets is excluding cash).

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### Further price impact...affecting other banks

- Prices were originally affected by an exogeneous shocks P > P'
- ▶ then, if exante it worths P' (to allow for collateral pricing) liquidation of X<sub>3</sub> leads to P'' < P'</p>
- still alive banks bear the price impact P"
- indirect deterioration of their balance sheet due to prices

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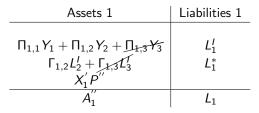


Table : Bank 1 balance sheet after liquidation

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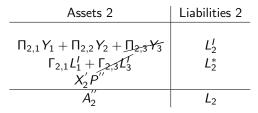


Table : Bank 2 balance sheet after liquidation

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### Interbank amplification

#### What's next?

### Margin calls between surviving banks on interbank debt

We introduce margin calls i.e. banks need to compensate the collateral depreciation with cash to obtain the same level of "safety".

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### The role of collateral in amplification mechanisms

▶ Banks 1 and 2 suffers collateral depreciation  $\delta(1) = \frac{X'_1 P''}{X_1 P}$  and  $\delta(2) = \frac{X'_2 P''}{X_2 P}$ . The margin call matrix *Mc*:

$$Mc = \begin{pmatrix} 0 & (1 - \delta(2))\Gamma_{col}(1, 2)L_2^{\prime} \\ (1 - \delta(1))\Gamma_{col}(2, 1)L_1^{\prime} & 0 \end{pmatrix}$$

such that banks 1 and 2 are characterized by their cash positions:

$$\begin{cases} X_1'(\bar{k}) + N(1) \\ X_2'(\bar{k}) + N(2) \end{cases}$$

• with N(1) = -N(2) = Mc(1,2) - Mc(2,1) the cash a bank need to provide (or not)

Objective Stylized balance sheet Bank default Bank liquidation Interbank amplification Asset price depreciation

- option 1: If the bank has a net negative position but enough cash to pay the compensation, its cash position decreases.
- option 2: if the bank has not enough cash to pay creditors, the bank has to sell part of its assets in order to fund liquidity. Let's assume bank 1 is short in liquidity, then the exante portfolio reduction is:

$$orall j < ar{k}, X_1^{''}(j) = X_1^{'}(j)(1 - rac{X_1^{'}(ar{k}) + N(1)}{\sum_{k=1}^{ar{k}-1} X_1^{'}(k) P^{''}(k)})$$

... and bank 2 bears a second price impact due to this liquidation such that cash position are

$$\begin{cases} X_{1}^{''}(\bar{k}) = 0 \text{ (bank 1 is illiquid)} \\ X_{2}^{''}(\bar{k}) = X_{2}^{'}(\bar{k}) + N(2) - (X_{1}^{'} - X_{1}^{''})(P^{''} - P^{'''}) \end{cases}$$

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#### we end up with bank 1:

Assets 1	Liabilities 1
$ \begin{array}{c} \Pi_{1,1}Y_1 + \Pi_{1,2}Y_2 + \Pi_{1,3}Y_3 \\ \Gamma_{1,2}L_2^{l} + \Gamma_{1,3}L_3^{\prime} \\ X_1^{\prime\prime}P^{\prime\prime\prime\prime} \end{array} $	L' <sub>1</sub> L <sub>1</sub> *
A'''	$L_1$

Table : Bank 1 at the end of the round

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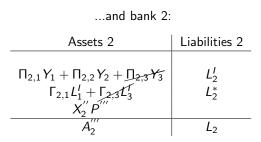
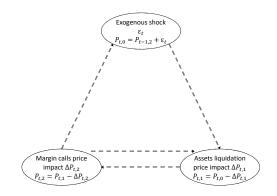


Table : Bank 2 at the end of the round

And this goes on until no more bank fails.

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### Regarding asset prices...



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Objective Stylized balance sheet Bank default Bank liquidation Interbank amplification Asset price depreciation

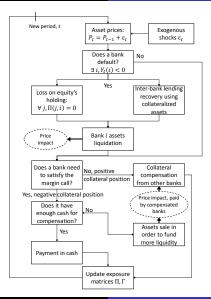
### Regarding asset prices...

In each round of asset depreciation, price variations are such that  $\Delta P = TV*Am*R_{\rm s}$  with

- R<sub>s</sub> a asset correlation matrix,
- Am the Amihud statistics
- ► *TV* the traded volume (amount of asset liquidation).

These matrices give a lot of flexibility:  $R_s$  can be state dependant, diagonal or full. The same applies to the Amihud statistics.

Objective Stylized balance sheet Bank default Bank liquidation Interbank amplification Asset price depreciation



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### Data Needs

- Good news: the model is flexible enough to integrate granular information as soon as it is available.
- Bad news: some information are scarce to perfectly proxy interconnection dynamics. Data access is key, especially for cross border analysis.
- In this paper we take 6 EU banks (some are G-SiB, some are not) supposed to be interconnected.
- The application is done for illustration purpose (experiment) and should not be taken as a formal regulatory stress testing exercise!

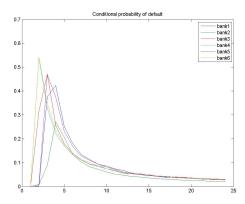
### Data Needs

- Π equity cross holdings (SNL data), mainly public
- Γ bank debt cross-holdings: reconstruction from the aggregate (proxy)
- ➤ X Exposures: balance sheet information in annual statements (as of 2014) on 6 asset classes: loans to non banking players, debt instruments, equity instruments, derivatives instruments, other securities and cash.
- ► *R* correlation matrix: asset prices/index and/or lending spreads

Probabilities of default Equity distributions

### Probabilities of default

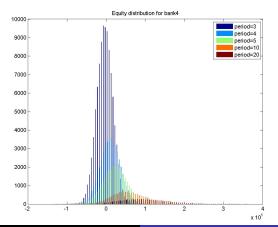
Even if the shock on trading assets is calibrated to cause no default in the first period, amplification phenomena are at play: first round evaluation underestimates the PDs.



Probabilities of default Equity distributions

### Equity distribution evolutions over time

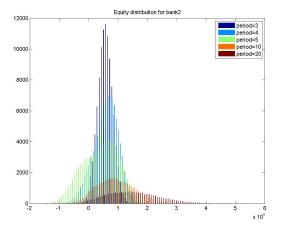
Example of a bank **not really affected** by second round effects [but significantly by 1st round]



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Probabilities of default Equity distributions

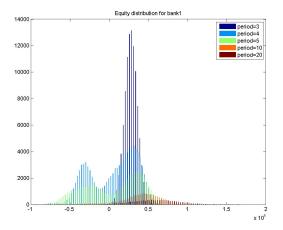
### Equity distribution evolutions over time Example of a bank affected by second round effects...



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Probabilities of default Equity distributions

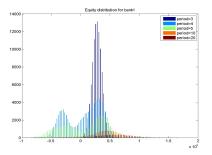
### Equity distribution evolutions over time Example of a bank really affected by second round effects...



Probabilities of default Equity distributions

### Equity distribution evolutions over time

Example of a bank really affected by second round effects...

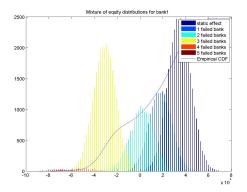


Why does this multimodality appear?.. due to amplification as soon as some domino effects threat the banking system.

Probabilities of default Equity distributions

### Equity distributions multimodality

Let decompose the equity distribution of Bank 1 at period 4, conditional to the number of failing banks at the previous round.



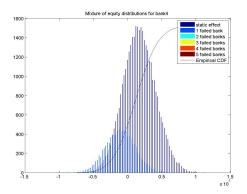
The bad equilibrium appears as soon as other banks are defaulting.

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Probabilities of default Equity distributions

### Equity distributions multimodality

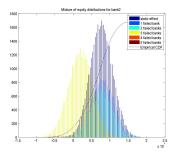
Is this by construction of a pessimistic model? NO because some banks are resilient.

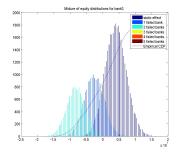


Probabilities of default Equity distributions

### Equity distributions multimodality

#### And some are intermediate cases



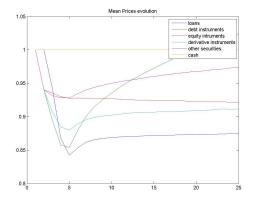


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Probabilities of default Equity distributions

### Asset price depreciation

Asset prices suffer, depending on the type of securities.



Bank systemicity Liquidity emergency

### **Policy implications**

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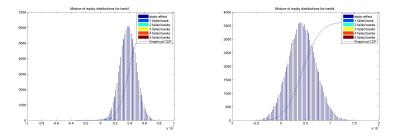
Bank systemicity Liquidity emergency

### Playing with bank systemicity

One can test the impact of individual defaults (as many other various shocks in this framework).

Here bank 2 defaults: no major direct and indirect impact =

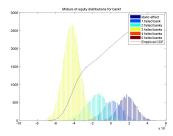
"manageable default" because of "unimodal" risk.

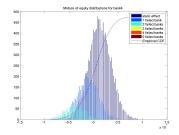


Bank systemicity Liquidity emergency

### Playing with bank systemicity

Here bank 3 defaults: Major direct and indirect impact = need to manage a bad equilibrium (amplification)





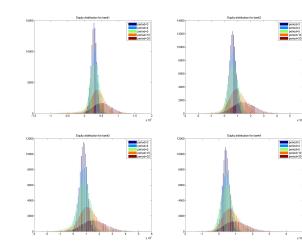
Bank systemicity Liquidity emergency

# Emergency Liquidity

- To test the ability of Central bank to act as a lender of last resort
- We calibrate the central bank intervention in such a way that it compensates the full losses at the first round of our stress testing exercise.
- it works if and ONLY if the Central bank fully compensates the losses = huge cost

Model Simulation and results Policy implications

Liquidity emergency



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× 10<sup>1</sup>

× 10<sup>1</sup>

Bank systemicity Liquidity emergency

### Policy alternatives

- The model is flexible enough to allow alternatives in policy making, beyond the only LOLR role of Central banks.
- Some alternatives:
  - Introducing exante capital or liquidity regulation
  - Introducing CCPs on the interbank market: in such a way margin calls are lower since the CCP fully compensates cash positions of banks
  - Variation margins: as a macroprudential tools, haircuts may be revised in times of distress to lower collateral constraints
  - Introducing hybrid instruments as convertible debt instruments
  - Introducing fair value pricing of assets used as collateral to lower depreciation and firesales probability.

# Conclusion

- ► We introduce in this paper a fully fledge model for assessing the vulnerabilities of banking systems with the advantage of:
  - being flexible enough to incorporate as much granular information is available
  - that takes into account second round effects of shock (interbank contagion, market contagion, shock amplification)
- The model has the main advantage to allow for complete stress testing and in a unified framework to test for a wide set of policy alternatives, with "nice" visualisation of intended effects.