# Domestic and International Sectoral Portfolios: Network Structure and Contagion Effects

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SUERF/PSE/CEPII Conference

September 16, 2016

### Introduction: This paper

This paper uses a unique comprehensive dataset on French portfolio assets and liability holdings to

- Study the dynamics of domestic and international sectoral portfolios
- Understand their network structure
- Estimate a model of contagion through intersectoral security linkages.

## Introduction: Key Questions

- What sectoral patterns are underlying the rapid deterioration of the net external portfolio position of France between 2008 and 2014 from a creditor position of 4.7 percent of GDP to a debtor position of -35.7 percent of GDP?
- How do shocks that originated in domestic sectors or the rest of the world propagate through the network structure formed by intersectoral asset and liability position (balance-sheet contagion)?

### Results: Stylized Facts

- Change in net external portfolio position of France was driven by:
  - banking sector retranchment on the asset side, and foreign expansion on the liability side
  - increase in foreign liablities of the public and coporate sector
  - but was mitigated by the expansion the domestic and foreign assets portfolio
    of the insurance sector (in 2014 one third of total assets were held by the
    insurance sector)
- Banking, corporate sector, and public sector increase foreign debt liabilities three to four times more vis--vis Non-Eurozone countries than vis--vis Eurozone countries.

### Results: Balance-sheet contagion model

- Financial sectors of the economy (banking sector, insurance sector, mutual funds) are strongly affected by financial contagion.
- The public sector and the corporate sector do not propage shocks through their balance-sheet.
- Through balance-sheet contagion the financial sectors are
  - Strongly exposed to foreign sector shocks
  - Increasingly exposed to public sector shocks

## Roadmap

- Data
- Literature
- Stylized Facts
  - Sectoral external portfolios
  - Network
- Model

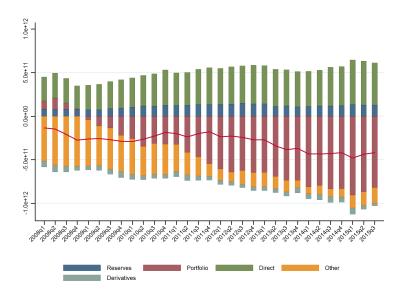
## Data: Protide (Banque de France)

- Database on security holdings collected by the Banque de France from direct and custodian reportings
  - Exhaustive data on security holdings by French residents
  - ► Frequency is quarterly, from 2008Q1 to today (but we stop in 2014)
- High level of granularity
  - Security-by-security database, with information about the characteristics of each security (including instrument type, nationality of the issuer)
  - Aggregation at the sector-level
- Integrated Domestic and Foreign Portfolios with both Assets and Liabilities.
   Full characterization of changes in assets and liabilities by sector-instrument.
- Full range of cross-holding: across sectors, between sector / rest of the word, between domestic / foreign sectors (for EA countries only)
- Compared to: CPIS
  - Sectoral information on holder positions only, not issuers, for a small sample of countries, in recent years
  - Only international portfolios
- Compared to: flow-of-funds
  - ▶ No breakdown between domestic and foreign portfolio at the sector level

#### Literature

- Eisenberg and Noe (2001): Propagation of shocks to outside assets and liability through banks balance-sheets.
- Castrén and Kavonius (2009): Shock transmission through flow-of-funds based on accounting rule. No direct measure of bilateral exposure.
- Galstyan et al. (2016): International sectoral portfolio with CPIS data.

#### Net External Investment Position of France



## Sectoral Breakdown: Change in Net External Portfolio

	Debt		Equity			Total	
Sector	Α	L	Net	Α	L	Net	Net
Banking sector	-7.8%	+6.5%	-14.3%	0	0	0	-14.3%
Mutual funds	+1%	+2.2%	-1.2%	0	+2.4%	-2.4%	-3.6%
Insurance sector	+4.9%	0	+4.9%	+1.4%	-1%	+2.4%	+7.3%
Corporate sector	0	+6.5%	-6.5%	0	+1.6%	-1.6%	8.1%
Household sector	0	0	0	+2.4%	0	+2.4%	+2.4%
Public sector	0	+26%	-26%	0	0	0	-26%
Total	-1.8%	+41.2%	-43%	3.8%	+3%	+0.8%	-42.2%

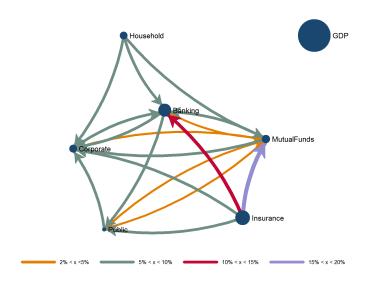
Table: Contributions in % of GDP, <1% set to zero

## Financial Sector Breakdown: Domestic vs. Foreign

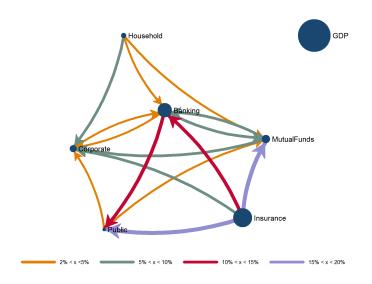
	2008.1			2014.1			
Sector	Α	L	Net	Α	L	Net	
Panel A: Domestic							
Banking sector	38.8%	56.1%	-17.3%	43.2%	49.2%	-5.9 %	
Mutual funds	24.3 %	39.4 %	-15.1 %	24.4 %	42.2 %	-17.8 %	
Insurance sector	44.9%	2.6%	42.3%	58.1%	0.73%	57.4%	
Panel B: Foreign							
Banking sector	41.1 %	25.5 %	15.6 %	31.9%	31.4%	0.5%	
Mutual funds	26.8 %	5.0%	21.8%	28.4%	9.6%	18.8%	
Insurance sector	26.8 %	1.9 %	24.9 %	33.1 %	0.6%	32.5 %	
Panel C: Consolidated							
Banking sector	79.96%	81.61%	-1.64%	75.1%	80.5%	-5.4%	
Mutual funds	51.1%	44.4%	6.7%	52.8%	51.8 %	1.0%	
Insurance sector	71.77%	4.50%	67.27%	91.2%	1.3%	89.9%	

Table: in % of GDP

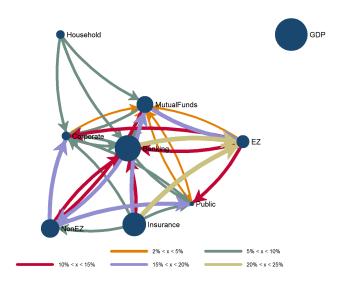
#### Domestic Sectoral Network - 2008.1



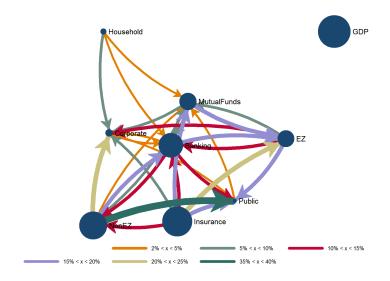
#### Domestic Sectoral Network - 2014.1



#### International Sectoral Network - 2008.1



#### International Sectoral Network - 2014.1



## Contagion model - Specification

$$\begin{split} \gamma_{j,t} &= \beta_{j,0} + \beta_{j,1} \left( \sum_{j'=1}^J \omega_{j,j',t} \gamma_{j',t} + \omega_{j,t}^\mathsf{X} \mathsf{X}_t \right) + \epsilon_{j,t}, \ \, \text{for} \, \, j = 1,...,J \\ & \text{where} \, \, \, \mathbb{E}\left[\epsilon_{j,t}\right] = 0 \ \, \text{for} \, \, j = 1,...,J \\ & \mathbb{C}\textit{ov}\left[\epsilon_{j,t},\epsilon_{j',t}\right] = \Sigma_\epsilon = \textit{diag}\left[\sigma_1,\sigma_2,...,\sigma_J\right] \end{split}$$

- ullet  $\gamma_{j,t}$  denotes the return on assets emitted by sector j
- $x_{i,t}$  is the return on foreign assets
- $\omega_{j,j',t}$  is the portfolio-share on assets emitted by sector j'
- $\omega_{i,i,t}^{\mathsf{x}}$  is the portfolio-share on outside assets
- $\bullet$   $\epsilon_{j,t}$  is a sector j specific shock to the return
- ullet  $eta_{j,1}$  is the balance-sheet contagion coefficient of sector j

## Contagion model - Two Step GMM Estimation

First order and second-order moments:

$$\begin{split} &\mathbb{E}\left[\left(I-\beta_{1}\omega_{t}\right)\gamma_{t}-\beta_{1}\omega_{t}^{x}x_{t}\right]-\beta_{0}=0\\ &\mathbb{E}\left[\left(\left(I-\beta_{1}\omega_{t}\right)\gamma_{t}-\beta_{1}\omega_{t}^{x}x_{t}-\beta_{0}\right)\left(\left(I-\beta_{1}\omega_{t}\right)\gamma_{t}-\beta_{1}\omega_{t}^{x}x_{t}-\beta_{0}\right)'\right]-\Sigma_{\epsilon}=0 \end{split}$$

## Contagion model - Estimates

	$\hat{eta}_0$	$\hat{eta}_{1}$	$\hat{\sigma}_{\epsilon}$		
Banking sector	0.003**	3.195***	0.008***		
	(.00)	(.96)	(.00)		
Insurance sector	-0.003	4.879***	0.026*		
	(.01)	(.94)	(.00)		
Mutual funds	-0.000	1.818***	0.007***		
	(.00)	(.06)	(.00)		
Corporate sector	-0.005	-0.261	0.068		
	(.02)	(139.71)	(.07)		
Public sector	0.006*	-0.371	0.012***		
	(.00)	(.32)	(.00)		
Significance: "***" at 1%; "**" at 5%; "*" at 10%					

Significance: "\*\*\*" at 1%; "\*\*" at 5%; "\*" at 10%

Table: Two-Step GMM estimates of model parameters

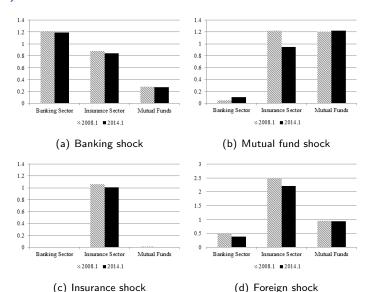
## Contagion model - Sectoral vulnerability

To determine how shocks propagate through the network, we look at the reduced form (in particular the Leontief inverse)

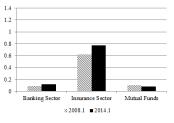
$$\gamma_t = [I - \beta_1 \omega_t]^{-1} (\beta_0 + \beta_1 \omega_t^{\mathsf{x}} x_t + \epsilon_t)$$

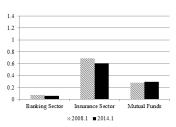
The **diffusion of shock** varies over time, since bilateral exposures  $(\omega_{j,j',t})$  change.

# Contagion model - Sectoral vulnerabilities (2008.1 vs 2014.1) - Financial sector shocks



# Contagion model - Sectoral vulnerabilities (2008.1 vs 2014.1) - Real sector shocks

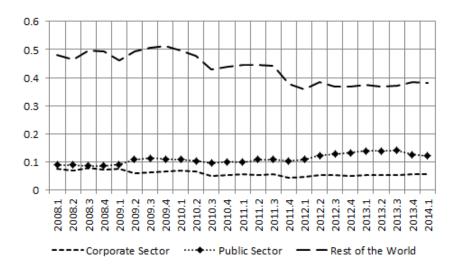




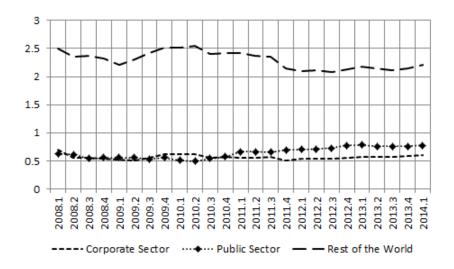
(e) Public shock

(f) Corporate shock

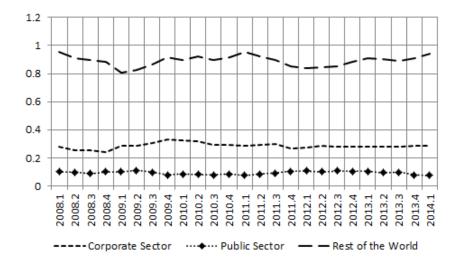
# Contagion model - Sectoral vulnerabilities (Time series) Banking sector



# Contagion model - Sectoral vulnerabilities (Time series) Insurance sector



# Contagion model - Sectoral vulnerabilities (Time series) Mutual funds

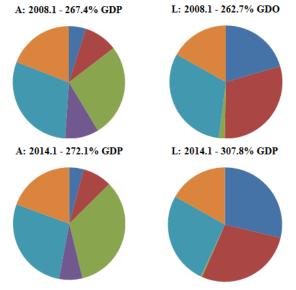


#### Conclusion

- We have shown how sectoral portfolios explain the sharpe deterioration of the Net External Portfolio Position of France from 2008 to 2014.
- The balance-sheet contagion model proposes a flexible way how to quantify balance-sheet contagion at the sector-level.
- Future research: extent the contagion model to include sector-specific leverage targets in the financial sectors.

#### Extra slides

## Sectoral Portfolios: the big picture (domestic + foreign)



#### Extra slides

## Sectoral Portfolios: the big picture (foreign only)

