

# Reciprocity in Shadow Bank Lending: Evidence from the Cross-Holding Relation in Money Market Funds

Ai He<sup>†</sup>

<sup>†</sup>Goizueta Business School, Emory University

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## Motivation

- ▶ Nonbank financial intermediaries (“shadow banks”: hedge funds, money market funds,... )
  - Provide banking function
  - Not subject to banking regulatory oversight
  - Variation in their lending may create panics spreading around the broader economy(e.g. runs in money market funds in 2008)
- ▶ U.S. Money market funds (MMFs)
  - A key source of wholesale funding in short-term credit markets
  - Money market instruments: short-term, high liquidity
  - Nearly \$3 trillion AUM by 2015

## Financial Firms in the MMFs Market

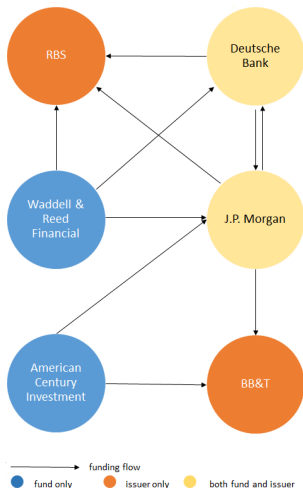
### ► Different roles

- Stand-alone funds
- Banks: issuers of money market instrument
- Banks: funds + issuers

### ► Banks with dual roles:

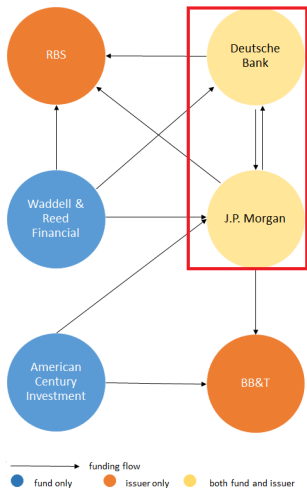
- 2010–2015, 24 of 163 banks borrowing from U.S. MMFs have affiliated MMFs.
- Issuer side: more than 30% of holdings in MMFs' overall portfolios
- Fund side: more than 46% of the total AUMs of all MMFs

### ► A financial firm unites affiliated MMFs and issuers as a unity. (Kacperczyk and Schnabl, 2013)



## The Cross-Holding Relation (CHR)

- ▶ A bilateral bonding between two financial firms:
  - JPM's MMFs hold DB's money market instruments
  - DB's MMFs hold JPM's money market instruments
- ▶ A potential reciprocity naturally arises.



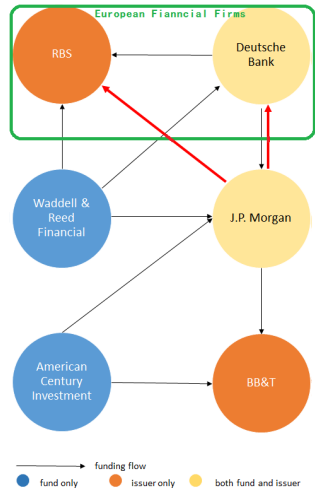
This paper: to which extent the reciprocal CHR affects MMFs' lending

## Endogeneity Concern and the 2011 European Bank Crisis

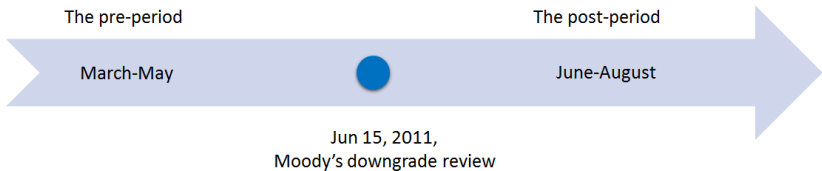
- ▶ MMFs are biased towards credit-worthy issuers
  - A laboratory environment: the difference in MMFs' stakes on different financial firms should be independent of these firms' creditworthiness.
  
- ▶ The European bank crisis in 2011
  - On June 15, 2011, Moody's placed several large European banks on review for possible downgrade.
  - Investors worry about European borrowers' creditworthiness: large outflows in MMFs with high exposure to European issuers (*Chernenko and Sunderam, 2014; Gallagher et al., 2015*).

# A Natural Experiment: MMFs' Stakes on European Issuers surrounding Moody's Review

- ▶ JPM's MMFs holdings:
  - in DB vs. in RBS
    - CHR does not matter: both decrease
    - CHR matters: different changes
- ▶ Independent of creditworthiness
- ▶ Control for time-varying variables and fixed effects



# Two Periods



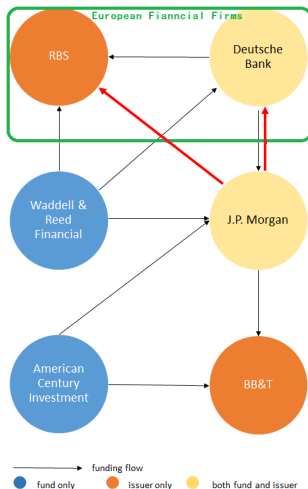
# Hypothesis Development

DB: JPM's connected European bank  
RBS: JPM's unconnected European bank

- ▶ Does CHR affect lending?

## Hypothesis 1.

In the post-period, MMFs increase their portfolio weights of the European banks which are in pre-existing CHR with the funds' sponsors.



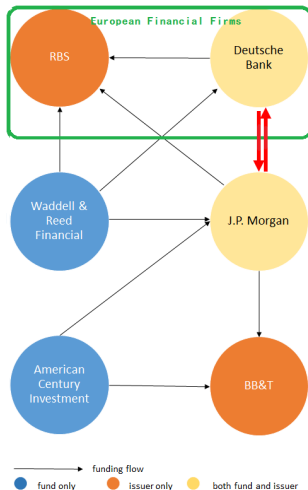


# Hypothesis Development

- ▶ **Reciprocity**  
*"you scratch my back and I scratch yours."*
- ▶ Reverse holdings:  
DB's MMFs holdings in JPM

## Hypothesis 2.

In the post-period, securities held in reverse fund-issuer pairs are different from securities in other fund-issuer pairs.



## Data and Sample

- ▶ SEC monthly form N-MFP
  - Prime MMFs: mainly invest in non-government securities, \$1.7 trillion AUM by August 2011.
  - Fund-level: gross yields, TNAs, maturities, advisors...
  - Class-level: Nasdaq tickers, net yields, shareholder flow activities...
  - Holdings-level data: issuer, yield, maturity date, value, type...
  
- ▶ CRSP Mutual Fund Database
  - Class-level: expense ratios, shareholder type (institutional or retail), ages...
  
- ▶ Factset and Bloomberg (manual check)
  - Each holding company's formal name, industry category, headquarter location...
  
- ▶ Markit CDS

## Measures and Variables

### Fund( $f$ )-Issuer( $i$ ) Pairs:

- ▶  $BConnected_{f,i}$ : pairs that are crossly held in the pre-period
- ▶  $RPairs_{f,i}$ :  $BConnected_{f,i}$  &  $f$  is owned by an European firm
- ▶  $Exposure_{f,i,t}$ : in month  $t$ , the fund  $f$ 's portfolio weight of money market instruments issued by issuer  $i$
- ▶ Risk measures (*Kacperczyk and Schnabl, 2013*):
  - *Spread*
  - *Maturity*
  - *Holdings Risk*: the weight of  $i$ 's insecure securities net of its secure securities in  $f$ 's portfolio
- ▶ Other issuer- and fund-level control variables: fund size, yield, age, expense ratio, institutional share, flow, issuer's CDS rate
- ▶ Fixed effects: month, issuer, fund, financial firm, issuer type

## Changes in MMFs' Exposure to European Financial Firms: Univariate Analysis

**Hypothesis 1.** In the post-period, MMFs increase their portfolio weights of the European banks which are in pre-existing CHR with the funds' sponsors.

- ▶ Between the two periods, a fund's exposure to European financial firms (measured in portfolio weights):
  - connected: increases by 0.35% (\$29.58 million)
  - unconnected: drops by 0.23% (\$19.66 million)

	Pair	Post		Pre		Diff(%)	SD(%)
	Number	Mean(%)	SD(%)	Mean(%)	SD(%)		
Panel A: European Issuers							
Connected	148	4.013***	3.906	3.660***	3.465	0.352**	1.564
Unconnected	3714	2.174***	1.802	2.408***	1.717	-0.234***	1.408
Panel B: Non-European Issuers							
Connected	278	2.112***	1.928	2.021***	2.032	0.091	1.350
Unconnected	3583	1.990***	1.600	1.811***	1.547	0.179***	1.214

## Changes in MMFs' Exposure to European Financial Firms : Multivariate Analysis

$$Exposure_{f,i,t} = \alpha + \beta_1 BConnected_{f,i} \times Post + \beta_2 BConnected_{f,i} + \beta_3 Post + \lambda Control + \epsilon_{f,i,t}$$

	(1)	(2)	(3)	(4)	(5)
BConnected × Post	0.379*** (0.134)	0.446*** (0.134)	0.403*** (0.132)	0.403*** (0.133)	0.361** (0.140)
BConnected	1.121* (0.585)	0.063 (0.283)	0.215 (0.279)	0.215 (0.280)	0.923*** (0.387)
Post	-0.320** (0.157)	-0.056 (0.083)	-0.034 (0.077)	-0.112* (0.061)	-0.296* (0.166)
Conglomerate × Post					0.591** (0.288)
Conglomerate					0.075 (0.096)
Month-Fixed Effects	Y	Y	Y	Y	Y
Fund-Fixed Effects	Y	N	Y	Y	Y
Issuer-Fixed Effect	N	Y	Y	Y	N
Sponsor-Fixed Effects	N	N	N	Y	Y
Issuer-Type-Fixed Effects	N	N	N	Y	N
Observations	10835	10835	10835	10835	10835
R <sup>2</sup>	0.268	0.276	0.421	0.421	0.289

With controls, std errors are two-way clustered at the fund-level and the issuer-level

## Changes in Reverse Pairs

**Hypothesis 2.** In the post-period, securities held in reverse fund-issuer pairs are different from securities in other fund-issuer pairs.

$$\text{HoldingRisk}_{f,i,t} = \alpha + \beta_1 \text{RPair}_{f,i} \times \text{Post} + \beta_2 \text{RPair}_{f,i} + \beta_3 \text{Post} + \lambda \text{Control} + \epsilon_{f,i,t}$$

	(1)	(2)	(3)	(4)	(5)
Reverse Pair × Post	14.258*** (4.418)	11.320*** (3.842)	10.852*** (3.685)	11.796*** (3.984)	11.316*** (3.846)
Reverse Pair	-11.452 (11.082)	-0.672 (3.734)	-5.295 (5.200)	-4.247 (7.775)	-5.576 (5.079)
Post	-4.139** (1.799)	-2.379** (1.103)	-1.384 (1.181)	-0.346 (1.030)	-2.367** (1.101)
BConnected	-27.462** (13.085)	-4.443 (5.421)	-4.483 (5.465)	-25.909** (12.900)	-5.305 (5.028)
European Issuer				5.375 (7.058)	
European Fund Sponsor					5.369 (4.525)
Month-Fixed Effects	Y	Y	Y	Y	Y
Fund-Fixed Effects	Y	N	Y	Y	N
Issuer-Fixed Effect	N	Y	Y	N	Y
Sponsor-Fixed Effects	N	N	N	Y	N
Issuer-Type-Fixed Effects	N	N	N	Y	Y
Observations	25345	25325	25325	25345	25325
R <sup>2</sup>	0.099	0.449	0.502	0.174	0.450

With controls, std errors are two-way clustered at the fund-level and the issuer-level

- ▶ In return, European financial firms, through their affiliated MMFs, accepted more insecure securities than secure ones from their connected partners.
- A form of benefit given insecure securities are unwelcome in post period.

## Spillover Effects

How deeply and widely the cross-holding relation affects the overall MMFs market?

- ▶ *SEuro Fund Share*: equal to one if  $i$ 's security is hold by MMFs who are involved in cross-holding relation with European issuers
- ▶ *Issuer Euro Share*: an issuer's indirect exposure to European issuers through MMFs (*Chernenko and Sunderam, 2014*)

$$\Delta \text{Outstanding}_i = \alpha + \beta \text{Issuer Euro Share}_i + \epsilon_i$$

	<i>SEuro Fund Share</i> =0			<i>SEuro Fund Share</i> =1		
	(1)	(2)	(3)	(4)	(5)	(6)
Issuer Euro Share	-0.102 (-0.367)	-0.118 (-0.411)	-0.117 (-0.404)	-1.129*** (-4.986)	-0.821** (-3.254)	-0.804** (-3.169)
European Issuer		0.035 (0.246)	0.036 (0.250)		-0.186* (-2.597)	-0.187* (-2.605)
Yield			1.230 (0.657)			0.654 (0.639)
Observations	130	130	130	165	165	165
$R^2$	0.001	0.002	0.006	0.134	0.170	0.172

- ▶ Those financial firms borrowing money from MMFs who are bilaterally connected with European issuers are prone to have trouble in raising money.

## Other Tests

- ▶ Control conglomerate: not because of “too big to fail”
- ▶ Test if the negative flow-EuroShare relationship still holds in MMFs with the CHR bias
- ▶ Not find any evidence showing that securities issued by MMFs' bilaterally-connected European issuers are less risky than other holdings in MMFs' portfolio after mid-2011



## Concluding Remarks

The cross-holding relation:

- ▶ Represents a reciprocity that is rooted in financial conglomerates' nature of serving dual roles of borrowers and lender in a particular market
- ▶ Explains some risky holdings in MMFs' portfolios
- ▶ Provides an implicit guarantee between financial institutions