

# The Information contained in Money Market Interactions: Unsecured vs. Collateralized Lending

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## Abstract

- Financial institutions rely globally on money markets to manage liquidity allocations. Money markets allow investors to efficiently exploit their liquidity surpluses through lending,
- Two relevant segments that have been commonly investigated are the unsecured money market (uncollateralized lending) and the collateralized money market (in which lending is protected through the use (and re-use) of collateral).
- Unsecured and collateralized money markets are not independent of each other. In fact, interactions in lending segments can be especially relevant during periods of high uncertainty.
- Nevertheless, the vast majority of the existing literature focuses its analysis independently either on the unsecured segment or on collateralized lending.
- The objective of this study is to fill this gap by studying the information contained in interactions between unsecured and collateralized channels.

## Structure of the Paper

- We present three-period model to describe interaction in unsecured and collateralized lending segments.
- We use a dataset of collateralized and uncollateralized lending activity in the Euro zone between June 2, 2008 and July 30, 2013.
- We model trading activity in each segment in a given day according to a Poisson process. Markets may move in the same direction (liquidity shocks) or in the opposite direction (migration event).
- We extract parameters of the distribution from trading data to signal different source of stress in money markets.
- We use such parameters to perform regression on the spread between the unsecured and secured market.

## The Theoretical Model

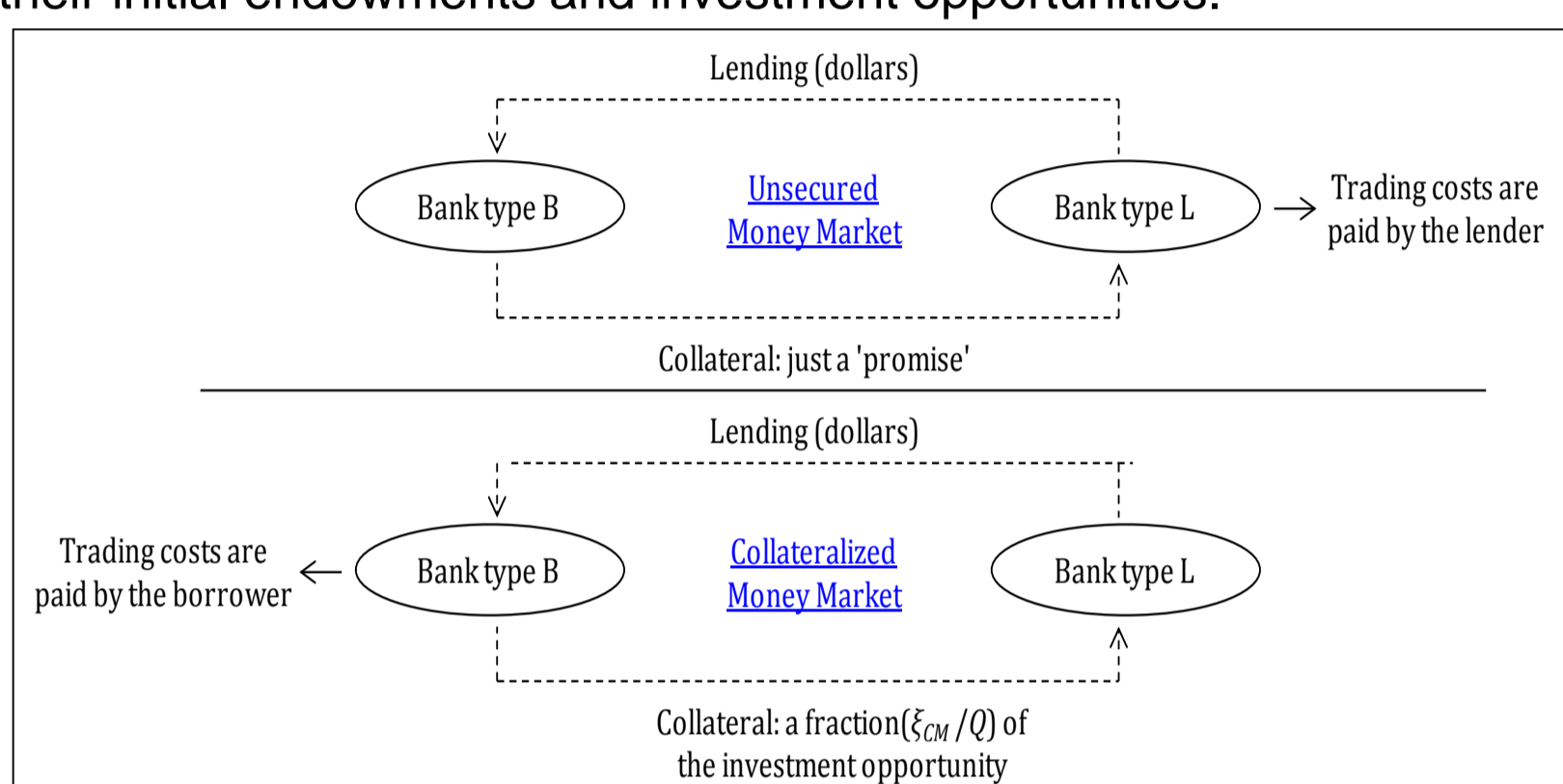
- We consider a **three-period horizon**. Dates are denoted by  $\{0, 1, 2\}$ . A single consumption good. We assume that there is no uncertainty of any kind, and the discount rate is equal to zero. Two types of firms (or banks): **Lenders, L, and borrowers, B**. Banks are risk neutral and differ in their initial endowments and investment opportunities.

- Bank type B at  $t=0$ :**  
No endowment.  
Investment opportunity (only if  $Q$  is invested) delivers:  
- Dividend  $d$  at  $t=1$ .  
- Return  $R$  at  $t=2$ .

- Bank type L at  $t=0$ :**  
 $M$  dollars ( $M \geq Q$ ).  
No investment opportunity.

- Unsecured money market (UM).**  
Bank B can borrow for two periods at  $t=0$  an amount of dollars  $\xi_{UM}$  from bank L. Interest rate  $r_{UM}$ . No collateral. There is a (quadratic) cost paid by the lender:  $k_{UM}(\xi_{UM})^2/2$  with  $k_{UM} \geq 0$ .  
- E.g., all the costs associated to counterparty risk.  
- No default in this market.

- Collateralized money market (CM).**  
Bank B can borrow (for two periods) at  $t=0$  an amount of dollars  $\xi_{CM}$  from bank L. Interest rate  $r_{CM}$ . Collateral: Bank B pays a fraction,  $\xi_{CM}/Q$ , of the dividend  $d$ . There is a quadratic cost paid by the borrower:  $k_{CM}(\xi_{CM})^2/2$  with  $k_{CM} \geq 0$ .  
- E.g., the opportunity cost of holding collateral, the risk of collateral depreciation



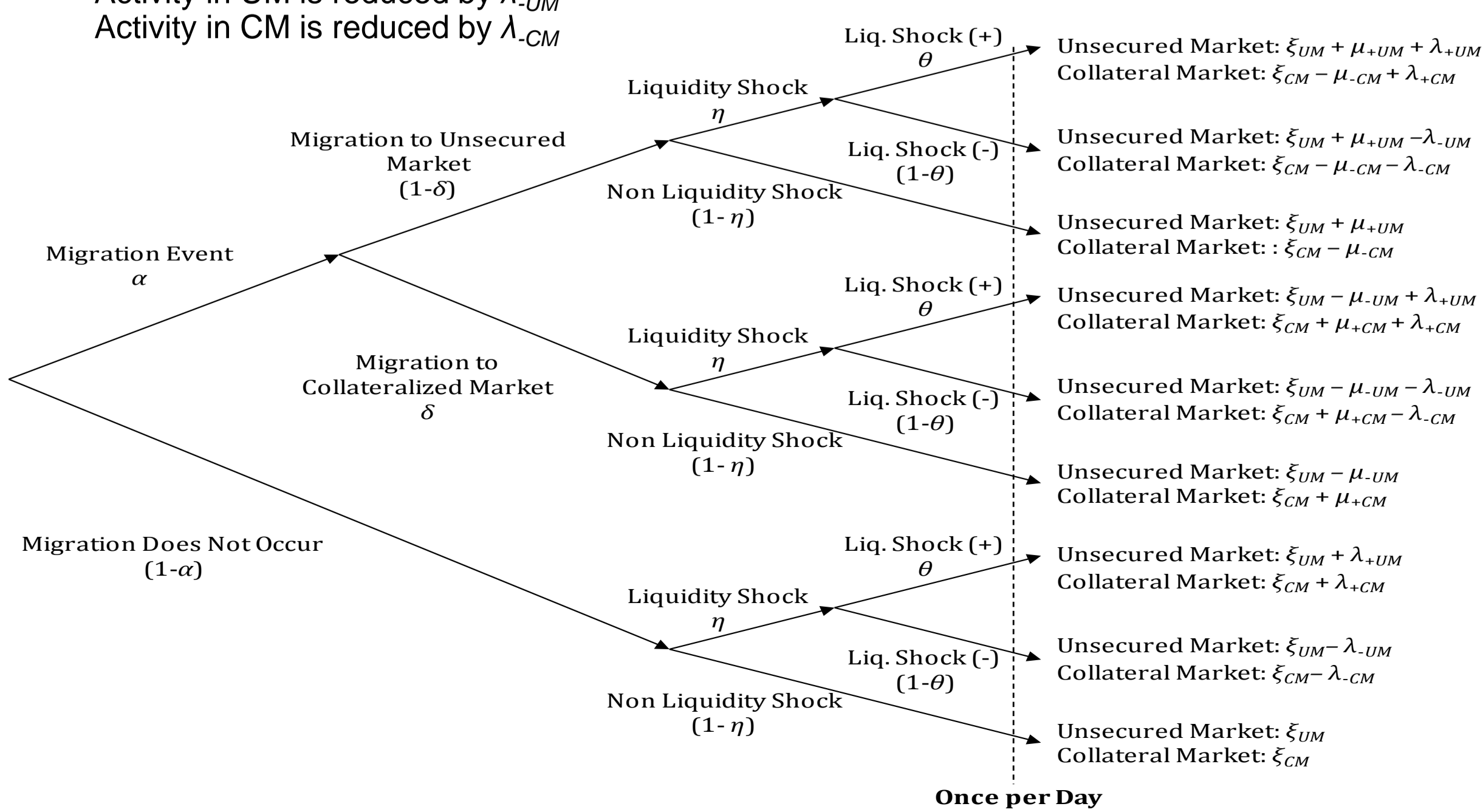
- In equilibrium, the optimal amount of trading is:  
 $\xi_{UM}^* = (1-h)Q$ ;  $\xi_{CM}^* = hQ$   
 $h = k_{UM}/(k_{CM} + k_{UM})$
- $h$  is the relative cost of trading in the UM;  
• If  $k_{UM}$  increases (i.e. increase in counterparty risk) and/or  $k_{CM}$  decreases (increase in collateral value and availability) there will be a trading migration from UM to CM
- The interest rate spread between unsecured and collateralized markets is obtained by market clearing and given by:  
 $r_{UM}^* - r_{CM}^* = k_{CM}hQ + \frac{d}{Q}$
- An increase in  $h$  (migration from UM to CM) determines an increase in the spread if solely caused by an increase in  $k_{UM}$

## The Empirical Model

- We introduce a model that captures daily market dynamics
- There is a set of risk-neutral banks and two money markets: Unsecured money market (UM) and Collateralized money market (CM).
- Trading activity arrives according to two Poisson processes with rates  $\xi_{UM}$  and  $\xi_{CM}$  for UM and CM, respectively.
- Both markets have activity over  $i = 1, \dots, I$  trading days. Time evolving continuously within each single day and represented by  $t \in [0, T]$ .
- A migration event (divergent-sign variation in trading) takes place on each day and with probability  $\alpha \in (0, 1)$ :  
UM  $\rightarrow$  CM with probability  $\delta$ :  
Activity in UM is reduced by  $\mu_{-UM}$   
Activity in CM increases by  $\mu_{+CM}$   
CM  $\rightarrow$  UM with probability  $(1-\delta)$ :  
Activity in UM increases by  $\mu_{+UM}$   
Activity in CM is reduced by  $\mu_{-CM}$
- A liquidity shock (same sign variation in trading) takes place on each day and with probability  $\eta \in (0, 1)$ :

Positive liquidity shock with probability  $\theta$ :  
Activity in UM increases by  $\lambda_{+UM}$   
Activity in CM increases by  $\lambda_{+CM}$

Negative liquidity shock with probability  $(1-\theta)$ :  
Activity in UM is reduced by  $\lambda_{-UM}$   
Activity in CM is reduced by  $\lambda_{-CM}$



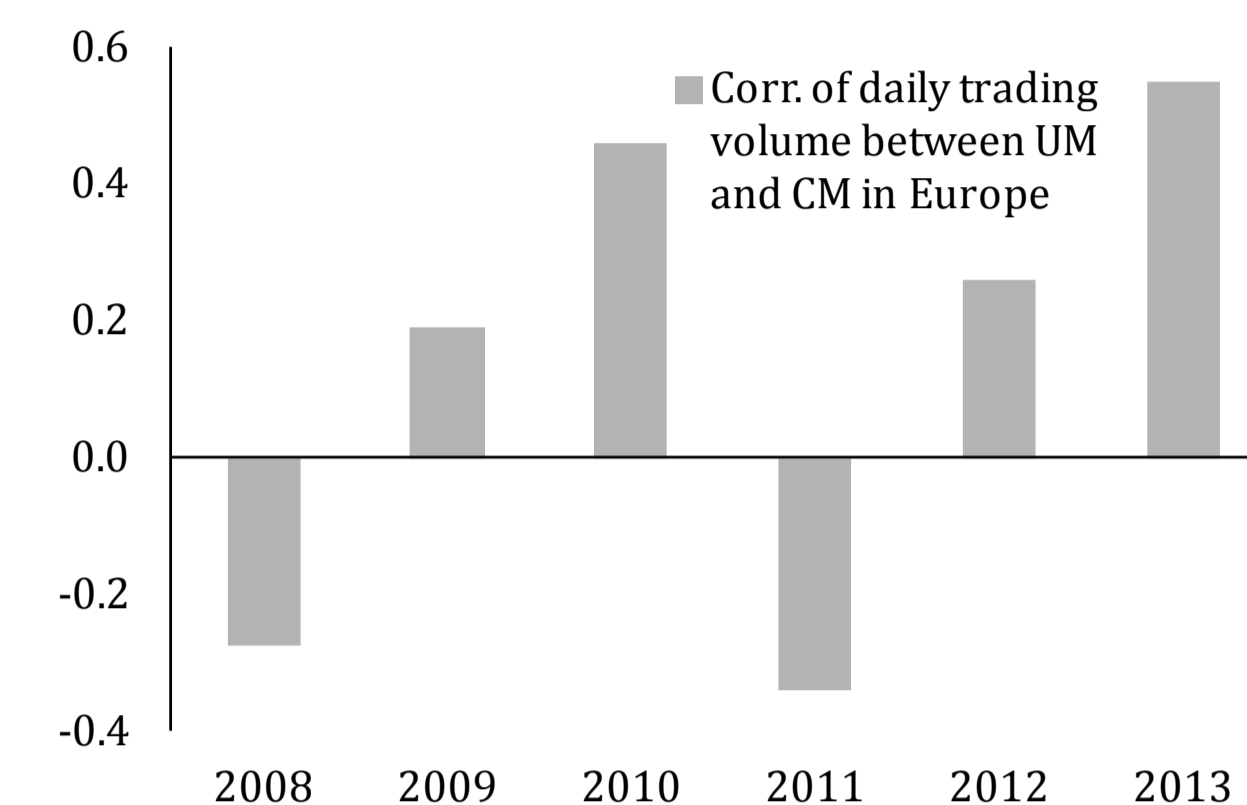
Across the  $I$  days the total Likelihood Function is:  $L(\varphi|M) = \prod_{i=1}^I L(\varphi|UM_i, CM_i)$

## Motivation

- To study the interaction of two important bank funding markets:  
• The interbank market for central bank reserves (i.e. uncollateralized lending); and  
• The repo market (i.e. bank lending through the use (and re-use) of collateral)

- Questions:  
• To which extent are unsecured and secured market substitutes?  
• Can trading activity migrate between funding segments and, in doing so, provide meaningful information about the state of health of the banking system and the money market?

- Hypotheses:  
• During periods of stress due to increased counterparty risk and/or increased uncertainty we should observe a migration in funding from the unsecured to the secured market (repo).  
• During periods of stress due to increased uncertainty over the quality of collateral we should observe a migration in funding from the secured to the unsecured market.



Annual Correlations of trading volumes between the unsecured market (UM) and in the collateralized market (CM) in Europe

- Correlation of trading activity between UM and CM have changed over time in Europe.  
• In 2008 and 2011 (turbulent years) UM and CM move in opposite direction.  
• In 2009, 2010, 2012, and 2013 both markets move in the same direction.

## The Data

- We use daily data of money markets in Europe between June 2, 2008 and July 30, 2013 (1,325 trading days).
- Unsecured money market (UM): Unsecured interbank loans with maturities ranging from one day (overnight) up to one year. Data from TARGET2, the real-time gross settlement payment system owned and managed by the Euro system.
- Collateralized money market (CM): We use repurchase agreement (repo) loans data. Repo loans with maturities that range from overnight to one year. Data from Eurex Repo:  
- One of the major Central Counterparty Clearing Houses (CCP) in Europe.  
- Almost 70% of interbank repo transactions in Europe are conducted via CCP platforms.

For UM:

Sudden decrease (2008 Q3 -Q4)

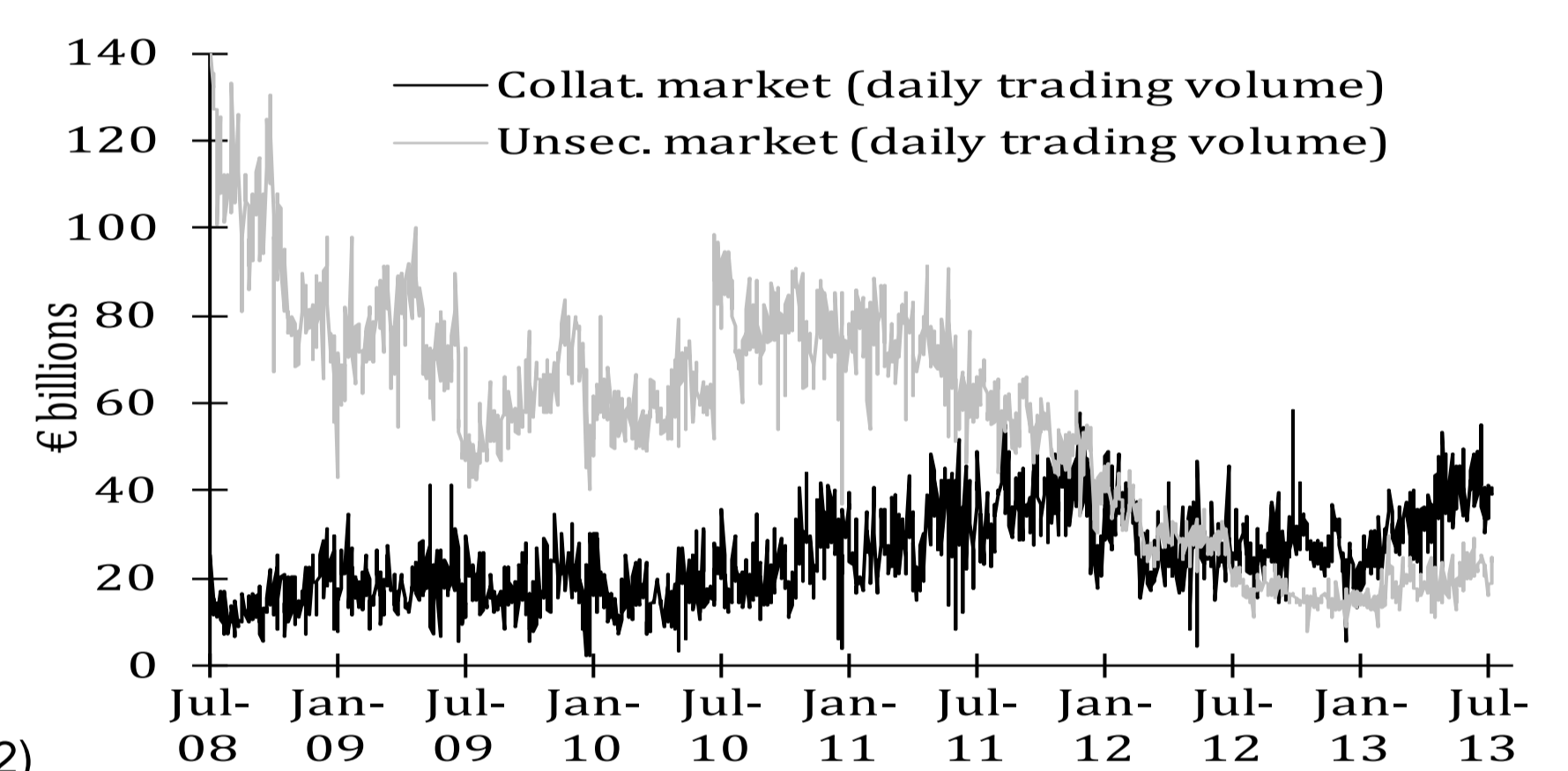
Partial recovery (2009 Q1 - 2011 Q2)

Further decrease (2011 Q3 - 2013 Q1)

Tepid increase (2013 Q2)

For CM:

Constant growth, except (2012 Q1 - Q2)



Daily trading volume in the unsecured market (UM) and in the collateralized market (CM) in Europe.

## The Empirical Model - results

- Using  $\varphi, UM$  and  $CM$  we compute 4 conditional probabilities, on a daily basis

$$P[MIG, CM \rightarrow UM / (UM, CM, \varphi)] = \frac{P[MIG] \cdot Prob[CM \rightarrow UM]}{P[CM, UM]}$$

$$P[MIG, UM \rightarrow CM / (UM, CM, \varphi)] = \frac{P[MIG] \cdot Prob[UM \rightarrow CM]}{P[CM, UM]}$$

$$P[LIQ+/ (UM, CM, \varphi)] = \frac{P[LIQ] \cdot Prob[LIQ+]}{P[CM, UM]}$$

$$P[LIQ-/ (UM, CM, \varphi)] = \frac{P[LIQ] \cdot Prob[LIQ-]}{P[CM, UM]}$$

## Do Posterior Probabilities Explain Market Spreads?

- We compute spread between Unsecured and Secured Rates

- We regress the interest rate spread on 1-day lagged

- posterior probabilities of migration and liquidity shocks and on:

- Prob of simultaneous defaults of two or more large banks
- Composite Indicator of Systemic Stress (CISS)
- Excess Liquidity in the Eurosystem (CA-RR+NSF)
- UM/CM Volume ratio

- We run least-squares regressions with heteroskedasticity and autocorrelation-consistent (HAC) standard errors

	$R_{UM,t} - R_{CM,t}$											
	Daily						Weekly					
const	-0.01*	0.00	-0.01	-0.01***	-0.01***	-0.01***	-0.02**	0.00	-0.01	-0.04***	-0.02***	-0.03***
$R_{UM,t-1} - R_{CM,t-1}$	0.58***	0.61***	0.58***	0.57***	0.62***	0.58***	0.54***	0.61***	0.58***	0.55***	0.64***	0.57***
$P_{MIG,UM \rightarrow CM,t-1}$	0.01***	0.01***	0.01***	0.01	0.01	0.01	-0.01	-0.02**	-0.02**	0.01	0.01	0.01
$P_{MIG,CM \rightarrow UM,t-1}$	0.02***	0.01	0.02***	0.01	0.02***	0.01	0.02	0.03**	0.03**	0.01	0.01	0.01
$P_{LIQ+,t-1}$	0.00	-0.02**	0.00	0.00	0.01***	0.00	-0.01*	-0.02**	-0.01*	0.01	0.01	0.01
$P_{LIQ-,t-1}$	0.00	0.00	0.00	0.00	0.00	0.00	0.01	0.01**	0.01**	0.01	0.01	0.01
$Vol_{CISS,t-1}/Vol_{CISS,t-1}$	0.00	0.01***	0.00	0.00	0.01***	0.00	0.01**	0.01**	0.01**	0.01	0.01	0.01
$ProbSimult_{t-1}$	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00
$CISS_{t-1}$	-0.09**	-0.09**	-0.08**	-0.12***	-0.12***	-0.12***	0.01	0.01**	0.01**	0.01	0.01	0.01
$EL_{t-1}$	0.04***	0.05***	0.06***	0.06***	0.06***	0.06***	0.02	0.03**	0.03**	0.02	0.02	0.02
$\Delta \log R_t^2$	0.50	0.48	0.49	0.51	0.48	0.50	0.57	0.56	0.56	0.58	0.56	0.57

## Results

- Conditional probabilities of migration are strongly significant
- Increase in probabilities of migration to CM is associated to increase in spread UM-CM
- Increase in probabilities of migration to UM is associated to decrease in spread UM-CM
- Consistent with the model, an increase in  $k_{UM}$  increases  $h$  and the spread

$$h = \frac{k_{UM}}{(k_{UM} + k_{CM})}; \xi_{UM}^* = (1-h)Q; \xi_{CM}^* = hQ; r_{UM}^* - r_{CM}^* = k_{CM}hQ + \frac{d}{Q}$$