

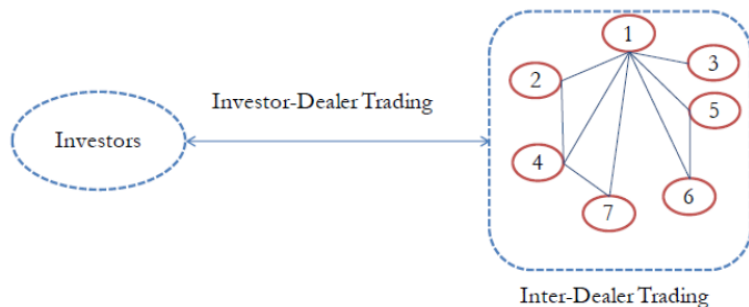
# The Risk Sharing Benefit versus the Collateral Cost: The Formation of the Inter-Dealer Network in OTC Trading

Kei Kawakami    University of Melbourne  
(Joint with Zhuo Zhong)

March 21, 2016

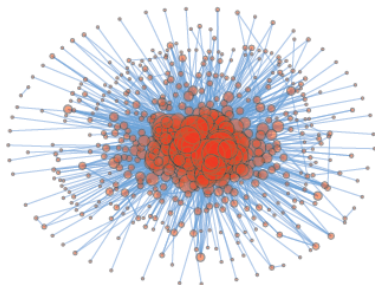
## The Over-the-Counter Market

- Many financial assets are traded in the OTC market, e.g., asset backed securities, bank loans, CDS, corporate bonds, and municipal bonds.
- What is inter-dealer trading in an OTC market?



# The Inter-Dealer Network in Empirical Studies

- Hollifield, Neklyudov, and Spatt (2015) document **the Core-Periphery Structure**.



- Prices and liquidity are related to this structure.
- In empirical studies, this network is treated exogenously.

## Questions

- How do dealers form the inter-dealer network?
- How does the inter-dealer network affect OTC trading?
- What explains the core-periphery inter-dealer network?

## Questions

- How do dealers form the inter-dealer network?
  - Dealers are risk averse and they trade through the inter-dealer network to share inventory risk.
- How does the inter-dealer network affect OTC trading?
- What explains the core-periphery inter-dealer network?

## Questions

- How do dealers form the inter-dealer network?
  - Dealers are risk averse and they trade through the inter-dealer network to share inventory risk.
  - The benefit from risk sharing and the cost of maintaining links determine the number of links each dealer has in equilibrium.
- How does the inter-dealer network affect OTC trading?
- What explains the core-periphery inter-dealer network?

## Questions

- How do dealers form the inter-dealer network?
  - Dealers are risk averse and they trade through the inter-dealer network to share inventory risk.
  - The benefit from risk sharing and the cost of maintaining links determine the number of links each dealer has in equilibrium.
- How does the inter-dealer network affect OTC trading?
- In equilibrium, the shape of the network determines...
  
- What explains the core-periphery inter-dealer network?

## Questions

- How do dealers form the inter-dealer network?
  - Dealers are risk averse and they trade through the inter-dealer network to share inventory risk.
  - The benefit from risk sharing and the cost of maintaining links determine the number of links each dealer has in equilibrium.
- How does the inter-dealer network affect OTC trading?
- In equilibrium, the shape of the network determines...
  - the relation between markups and order sizes;
- What explains the core-periphery inter-dealer network?



## Questions

- How do dealers form the inter-dealer network?
  - Dealers are risk averse and they trade through the inter-dealer network to share inventory risk.
  - The benefit from risk sharing and the cost of maintaining links determine the number of links each dealer has in equilibrium.
- How does the inter-dealer network affect OTC trading?
- In equilibrium, the shape of the network determines...
  - the relation between markups and order sizes;
  - the relation between markups and volatility.
- What explains the core-periphery inter-dealer network?

## Questions

- How do dealers form the inter-dealer network?
  - Dealers are risk averse and they trade through the inter-dealer network to share inventory risk.
  - The benefit from risk sharing and the cost of maintaining links determine the number of links each dealer has in equilibrium.
- How does the inter-dealer network affect OTC trading?
- In equilibrium, the shape of the network determines...
  - the relation between markups and order sizes;
  - the relation between markups and volatility.
- What explains the core-periphery inter-dealer network?
- Differences in dealers'...

## Questions

- How do dealers form the inter-dealer network?
  - Dealers are risk averse and they trade through the inter-dealer network to share inventory risk.
  - The benefit from risk sharing and the cost of maintaining links determine the number of links each dealer has in equilibrium.
- How does the inter-dealer network affect OTC trading?
- In equilibrium, the shape of the network determines...
  - the relation between markups and order sizes;
  - the relation between markups and volatility.
- What explains the core-periphery inter-dealer network?
- Differences in dealers'...
  - capacity of providing liquidity.

## Questions

- How do dealers form the inter-dealer network?
  - Dealers are risk averse and they trade through the inter-dealer network to share inventory risk.
  - The benefit from risk sharing and the cost of maintaining links determine the number of links each dealer has in equilibrium.
- How does the inter-dealer network affect OTC trading?
- In equilibrium, the shape of the network determines...
  - the relation between markups and order sizes;
  - the relation between markups and volatility.
- What explains the core-periphery inter-dealer network?
- Differences in dealers'...
  - capacity of providing liquidity.
  - order size from investors (work-in-progress).

# Outline

- The Benchmark Model: Homogeneous Dealers.
- The Extended Model: Heterogeneous Dealers.
- Conclusion.

# Benchmark Model

Assets.

- A risk free asset with a value 1.
- A risky asset which has a random value  $v \sim N(\bar{v}, \sigma^2)$ .

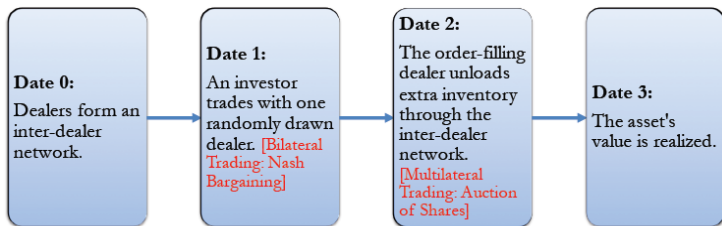
A set of dealers  $\mathcal{N}$  with  $|\mathcal{N}| = N \geq 3$ .

- Mean-Variance preferences  $u(W) = E[W] - \frac{\rho}{2} V[W]$ .
- Each with  $I$  units of risky asset.

Matching technology

- Every dealer has the probability  $\frac{1}{N}$  of trading with an investor.

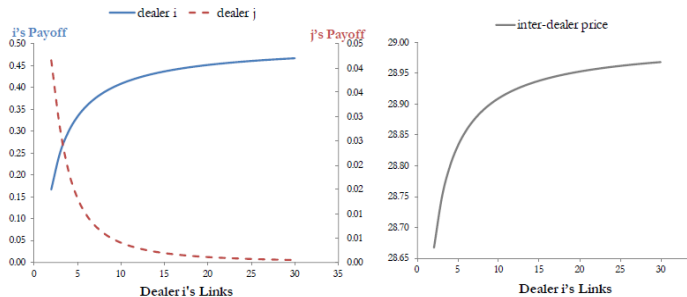
# Timeline



- D0 Each dealer  $i$  forms his selling network  $\mathcal{N}_i \subset \mathcal{N} \setminus \{i\}$ .
- D1 An investor sells  $z$  units of risky asset to one dealer by Nash bargaining ( $\rightarrow p_1$ ).
- D2 The order-filling dealer unloads inventory by a share auction in his network ( $\rightarrow$  inter-dealer price  $p_2$  and volume).

## Dealers' Gains from Risk Sharing

- Both the order-filling dealer ( $i$ ) and his connected dealers ( $j$ ) gain from inter-dealer trading.
- The number of  $i$ 's links has an asymmetric effect on  $(i, j)$ .
- Inter-dealer price increases with the number of links.





## Network Formation

- In an auction  $\mathcal{N}_i$  with  $|\mathcal{N}_i| = n_i$ , equilibrium volume is  $\frac{n_i - 1}{n_i + 1} z$ .
- The linking cost comes from the funding cost of collateral:

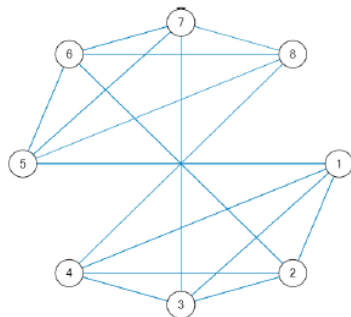
$$\underbrace{\text{Pr}(\text{sell in inter-dealer trading})}_{(1)} \times \underbrace{\sigma \frac{n_i - 1}{n_i + 1} z}_{(2)} \times \underbrace{m}_{(3)} .$$

- (1) The probability that collateral is needed in inter-dealer trading (only the seller needs collateral).
- (2) The risk (standard deviation) of the value of shares sold.
- (3) The margin requirement  $m$ .

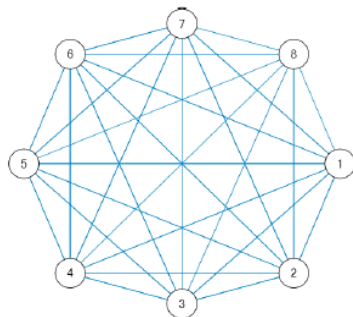
- The overall expected payoff for  $i$  in the network  $\{\mathcal{N}_i\}_{i=1}^N$ :

$$\begin{aligned}
 U_i \left( \{\mathcal{N}_i\}_{i=1}^N \right) &= \overbrace{\frac{1}{N} u \left( v \left( l + \frac{2z}{n_i + 1} \right) + f - p_2^i x_i(p_2^i) - z p_1^i \right)}^{i \text{ fills the order}} \\
 &+ \overbrace{\frac{1}{N} \sum_{j:i \in \mathcal{N}_j} u \left( v \left( l + \frac{n_j - 1}{n_j (n_j + 1)} z \right) + f - p_2^j x_i(p_2^j) \right)}^{i\text{'s connected dealers fill the order}} \\
 &+ \overbrace{\left( 1 - \frac{1}{N} - \frac{1}{N} \sum_{j:i \in \mathcal{N}_j} \right) u(vl + f)}^{\text{neither } i \text{ nor his connected dealers fill the order}} \\
 &- \overbrace{\frac{1}{N} \sigma \frac{n_i - 1}{n_i + 1} z m}^{\text{total cost of links}}
 \end{aligned}$$

**Proposition 1**     *A strongly stable network is symmetric.*



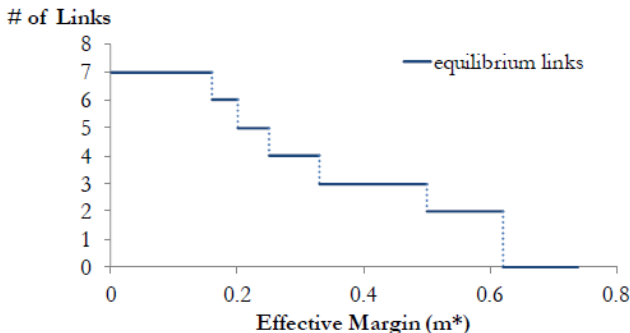
4 Links



7 Links

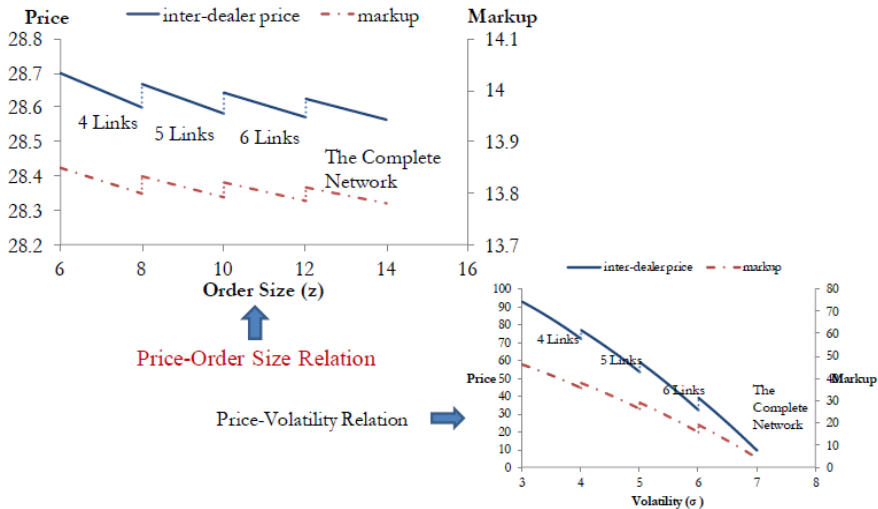
- In the benchmark, all dealers have the same number of links.

# Comparative Statics of Equilibrium Network



- The effective margin is defined as  $m^* \equiv \frac{2}{\rho\sigma z} m$ .
- Equilibrium number of links  $n_i^* = n^*$  increases in:  
(i) order size  $z$ , and (ii) volatility  $\sigma$  or risk aversion  $\rho$ .

# Asset Pricing Implications



# Outline

- The Benchmark Model: Homogeneous Dealers.
- **The Extended Model: Heterogeneous Dealers.**
- Conclusion.

## Limit of the Benchmark Model

- A symmetric network is counter-factual.
- Only one auction is used. No order splitting across multiple auctions.

The current draft:

- Three types of dealers with **heterogeneous capacity** of providing liquidity.
- Dealers with large (small) capacity stay at the core (periphery).

Work-in-progress:

- Dealers with **heterogeneous amounts of risky asset** form auctions and submit orders to multiple auctions simultaneously.

## Heterogeneous Endowments (work-in-progress)

- An auction among  $n + 1$  dealers, each with endowment  $l_i$ .
- Heterogeneous gains from trade:

$$G_i = \frac{\rho\sigma^2}{2} \frac{n^2 - 1}{n^2} (l_i - \bar{l})^2, \quad \bar{l} \equiv \frac{1}{n+1} \sum_{i=1}^{n+1} l_i.$$

- An additional trader affects  $G_i$  through two channels:
  1.  $\frac{n^2-1}{n^2}$  (liquidity effect); and
  2.  $\bar{l}$  (distributional effect).



## Asymmetric Impact of Adding Another Dealer

$$G_i = \frac{\rho\sigma^2}{2} \times \overbrace{\frac{n^2 - 1}{n^2}}^{\text{Liquidity effect}} \times \overbrace{\left(l_i - \bar{l}\right)^2}^{\text{Distributional effect}} .$$

- Distributional effect can be **asymmetric**:  
positive (negative) if  $\bar{l}$  moves away from (closer to)  $l_k$ .

Example (benchmark model):

- The order-filling dealer  $i$  and dealer  $j$  in  $i$ 's network  $\mathcal{N}_i$ :

$$G_i = \frac{\rho\sigma^2}{2} \frac{n_i^2 - 1}{n_i^2} \left\{ (l + z) - \left( l + \frac{z}{n_i + 1} \right) \right\}^2 ,$$

$$G_j = \frac{\rho\sigma^2}{2} \frac{n_i^2 - 1}{n_i^2} \left\{ l - \left( l + \frac{z}{n_i + 1} \right) \right\}^2 .$$

- $|l_i - \bar{l}|$  increases in  $n_i$  while  $|l_j - \bar{l}|$  decreases in  $n_i$ .

## Multiple Auctions

- $i = 1 \sim N$  dealers and  $k = 1 \sim K$  auctions. Let  $\mathcal{N}_k$  be a set of dealers who trade in auction  $k$  and  $N_k \equiv |\mathcal{N}_k|$ .
- Let  $\mathcal{K}_i$  be a set of auctions in which dealer  $i$  trades.

**Proposition** *A vector of asset positions after trading,  $Y = [Y_1, \dots, Y_N]^T$ , is linear in  $I = [I_1, \dots, I_N]^T$ :*

$$Y = \Phi^{-1}I, \quad \text{where } \Phi \equiv \begin{bmatrix} 1 + \chi_1 & -\Gamma_{1,2} & \cdots & -\Gamma_{1,N} \\ -\Gamma_{2,1} & \ddots & & \vdots \\ \vdots & & \ddots & \\ -\Gamma_{N,1} & \cdots & & 1 + \chi_N \end{bmatrix},$$

$$\chi_i \equiv \sum_{k \in \mathcal{K}_i} \frac{(N_k - 2)(N_k - 1)}{N_k} \quad \text{and} \quad \Gamma_{i,j} \equiv \sum_{k \in \mathcal{K}_i} \frac{N_k - 2}{N_k} \mathbf{1}_{[j \in \mathcal{K}_i]} = \Gamma_{j,i}.$$

## Incremental Value of Auctions

- Given  $Y = [Y_1, \dots, Y_N]^T$ , gains from trade are  $G(\mathcal{K}_i) =$

$$\rho\sigma^2 \left[ \sum_{k \in \mathcal{K}_i} (N_k - 2) (\bar{Y}_k - Y_i)^2 + \frac{1}{2} \left\{ \sum_{k \in \mathcal{K}_i} (N_k - 2) (\bar{Y}_k - Y_i) \right\}^2 \right]$$

- The contribution of auction  $k$  is  $V_{i,k} \equiv G_i(\mathcal{K}_i) - G_i(\mathcal{K}_i - k)$

$$= \rho\sigma^2 (N_k - 2) N_k (\bar{Y}_k - Y_i)^2 \left( \frac{1}{2} + \sum_{k' \in \mathcal{K}_i - k} \frac{N_{k'} - 2}{N_k} \frac{\bar{Y}_{k'} - Y_i}{\bar{Y}_k - Y_i} \right).$$

- Question: **Who benefits the most from each auction?**

## Conclusion

- The first paper that endogenizes the inter-dealer network in OTC trading.
- Dealers form the inter-dealer network for risk sharing.
  - Assets with high volatility and traded in large order size have more connected networks.
  - When the collateral cost is high, the network is less connected.
- Empirical studies should take account of the network effect to avoid model misspecification.
  - The price-size relation and price-volatility relation may encounter structural breaks, since the order size or volatility can change the network structure.
- Heterogeneous capacity or endowment (work-in-progress) can explain the core-periphery network.
  - Dealers with large (small) capacity stay at the core (periphery).
  - (conjecture) dealers with extreme positions stay at the core.