## The Economics of OTC markets

Lecture 2

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#### **Dealer profits**

 The steady-state flow of profits generated by the dealer sector in the semicentralized market

$$\Pi(\lambda) := \lambda \int_{\mathcal{D}} \theta \left( \boldsymbol{P} - \boldsymbol{R}(\delta) \right) \left( \mathbf{1}_{\{\delta < \delta^{\star}\}} \boldsymbol{d} \Phi_{1}^{\lambda}(\delta) - \mathbf{1}_{\{\delta > \delta^{\star}\}} \boldsymbol{d} \Phi_{0}^{\lambda}(\delta) \right)$$
$$= \frac{\lambda \theta \left| \boldsymbol{L}(\boldsymbol{s}, \gamma; \boldsymbol{F}) \right|}{(\gamma + \lambda) \left( \boldsymbol{r} + \gamma + \lambda (1 - \theta) \right)}$$

attains its maximum at

$$\lambda^* := \left(\gamma \times \frac{r+\gamma}{1-\theta}\right)^{1/2}$$

⇒ The optimal "monopolistic" contact rate is *finite* and increasing with respect to  $\gamma$ , *r*, and  $\theta$ 

## **Request for quotes**

An alternative price-setting mechanism

- Investors contact dealers at rate  $\lambda$
- Can send a request for quotes to *n* ≥ 2 randomly selected dealers
- Each dealer responds with probability  $1 \pi \in (0, 1)$
- Data for CDS market:  $\pi \approx 10\%$
- Dealers participate in a small auction as in the price dispersion paper of Burdett and Judd (83)
- Dealers have complete infomation about investors types
- Focus wlog on a buyer sending an RFQ

#### **RFQ** with 4 dealers



## A dealer's profits

- Denote by P the interdealer price
- Other respondent dealers each draw a θ<sub>i</sub> from a distribution G on
   [0, 1] and quote (1 θ<sub>i</sub>) P + θ<sub>i</sub>R(δ)
- $\Rightarrow$  A dealer quoting  $\theta$  earns

$$\Pi(\theta) := \theta \left( \boldsymbol{R}(\delta) - \boldsymbol{P} \right) \sum_{k=1}^{n} \phi_k \left( 1 - \boldsymbol{G}(\theta) \right)^{k-1} \alpha_k(\theta)$$

where  $\phi_k$  is the probability of k - 1 other quotes, and

$$\alpha_k(\theta) := \sum_{\ell=0}^{k-1} \frac{C_\ell^{k-1}}{1+\ell} \left[ \frac{\Delta G(\theta)}{1-G(\theta-)} \right]^\ell \left[ 1 - \frac{\Delta G(\theta)}{1-G(\theta-)} \right]^{k-1-\ell}$$

gives the probability that  $\theta$  is accepted conditional on all other offers being *weakly* dominated

#### Derivation

- Probability of k quotes:  $\phi_k := C_{k-1}^{n-1} (1-\pi)^{k-1} \pi^{n-k}$
- Probability that k 1 other quotes are *weakly* dominated:

$$\mathbf{P}\left[ heta \leq \min_{i \leq k-1} heta_i | heta 
ight] = (1 - G( heta - ))^{k-1}$$

 A weakly dominated quote is equal to θ with probability 1 – p and strictly greater with probability

$$p := \mathbf{P} \left[ \theta < \theta_i | \theta \text{ and } \theta \leq \theta_i \right] = 1 - \frac{\Delta G(\theta)}{1 - G(\theta -)}$$

 If there are *l* quotes equal to *θ* then one is accepted at random and the dealer wins with probability 1/(1 + *l*)

## Equilibrium

An equilibrium is a distribution such that

$$\Pi( heta') \leq \sup_{q \in \mathrm{supp}(G)} \Pi(q) = \Pi( heta), \qquad orall ( heta', heta) \in [0, 1] imes \mathrm{supp}(G)$$

In words: Dealers should be indifferent to any  $\theta \in \text{supp}(G)$  and should have no incentives to quote outside of that set

**R1** If  $\psi_1 < 1$  where

$$\psi_k := \mathbf{P}[k \text{ quotes}|\ell \ge 1 \text{ quotes}] = rac{C_k^n (1-\pi)^k \pi^{n-k}}{1-\pi^n}$$

then either  $G = \text{dirac}_0$  or G is continuous on [0, 1] and supported on  $[\underline{\theta}, 1]$  for some  $\underline{\theta} \in (0, 1)$ 

## Proof of R1

Assume  $\psi_1 < 1$  and let  $\sigma = \text{supp}(G)$ 

1. If *G* is not concentrated at 0

 $\Rightarrow \exists \theta > 0 \text{ such that } G(\theta -) < 1 \Rightarrow \overline{\Pi} = \Pi(\theta) > 0$ 

 $\Rightarrow \underline{\theta} = \inf \{ \sigma \} > 0 \text{ because } \Pi(0) < \overline{\Pi}$ 

- 2. If  $\overline{\theta} = \max{\{\sigma\}} < 1$  then offering  $\overline{\theta} + \epsilon$  is a profitable deviation as it improves the terms of trade by a discrete amount but only reduce the trade probability by an infinitesimal amount
- If G include a point mass at some θ<sub>1</sub> ∈ σ then quoting θ<sub>1</sub> − ε is a proditable deviation because it improves the trade probability by a discrete amount by eliminiating all offers at θ<sub>1</sub>, but only worsens the terms of trade by an infinitesimal amount

## Proof of R1

Assume  $\psi_1 < 1$  and let  $\sigma = \text{supp}(G)$ 

5. If *G* is flat over some interval  $[\theta_1, \theta_2] \subseteq \sigma$  then quoting  $\theta_2 \notin \sigma$  is a profitable deviation as it decreases the dealer's probability of trade by an arbitrary small amount but imporves the terms of trade by a discrete amount

## Equilibrium

**R2** In the *unique* equilibrium of the game:

1. If 
$$\psi_1 = 0$$
 then  $G = \text{dirac}_0$ (Bertand)2. If  $\psi_1 = 1$  then  $G = \text{dirac}_1$ (Monopoly)3. If  $\psi_1 \in (0, 1)$  then

$$G(\theta) = \mathbf{1}_{\{\theta > \phi_1\}} \frac{1 - (\theta/\phi_1)^{\frac{1}{1-n}}}{1 - \pi}$$

- **R3** The average transaction price of any investor is the same as in a semicentralized market with  $\theta \equiv \psi_1$
- **R4** The implied bargaining power  $\psi_1$  is decreasing in the number *n* of contacted dealers and in the probability  $1 \pi$  that a contacted dealer quotes a price

#### Proof of R2

Assume that the probability  $\psi_1 \in (0, 1)$ 

- G = dirac<sub>0</sub> cannot be an equilibrium: If it was then any dealer would prefer to quote θ > 0 because Π(θ) > 0 due to the fact that ψ<sub>1</sub> > 0 guarantees a strictly positive trade probability
- $\Rightarrow$  R1: *G* is continuous with support [ $\underline{\theta}$ , 1] for some  $\underline{\theta} > 0$
- 2. This implies that  $\Pi(\theta) = \Pi(1)$  for all  $\theta$  in that interval. Expanding this equality and using that  $\alpha_k(\theta; G) = 1$  when *G* is continuous we deduce that

$$\frac{\Pi(1) - \Pi(\theta)}{R(\delta) - P} = \phi_1 - \sum_{k=1}^n \phi_k \theta \left(1 - G(\theta)\right)^{k-1} = 0, \quad \theta \in [\underline{\theta}, 1]$$

and the result follows by solving this equation

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## **Transaction price**

• In equilibrium:

$$H(\theta) := \mathbf{P} [\text{best quote} \le \theta] = \sum_{k=1}^{n} \psi_k \left( 1 - (1 - G(\theta))^k \right)$$

 $\Rightarrow$  The *expected* buying price of the investor is

$$\theta^* R(\delta) + (1 - \theta^*) P$$

with the bargaining power

$$\theta^* := \mathbb{E}^H[\theta] = \int_0^1 \sum_{k=1}^n k \psi_k \theta \left(1 - G(\theta)\right)^{k-1} dG(\theta) \equiv \psi_1$$

where the last equality follows by computing the inner sum and then integrating the result

## Equilibrium



## **Decentralized market**

- Bilateral trade
  - Contact at rate  $\lambda$
  - Nash bargaining under complete information
  - Buyer bargaining power  $\theta_0 \in [0,1]$
- Key novelty:
  - $(\Phi_{0t}, \Phi_{1t})$  depend on trading decisions
  - Trading decisions depend on value of search options
  - Value of search options depend on (Φ<sub>0t</sub>, Φ<sub>1t</sub>)
- Serves as a building block for a model of frictional intermediation where investors trade through dealers (SC) and dealers trade in a frictional market

## **Decentralized market**



#### **Reservation values**

Proceeding as in the semicentralized market setting shows that reservation values solve

$$rR_{t}(\delta) = \dot{R}_{t}(\delta) + \delta + \gamma \mathbb{E}^{F} [R_{t}(x) - R_{t}(\delta)]$$
(RV)  
(resell)  $+ \lambda \theta_{1} \int_{\mathcal{D}} (R_{t}(x) - R_{t}(\delta))^{+} d\Phi_{0t}(x)$   
(buy-back)  $- \lambda \theta_{0} \int_{\mathcal{D}} (R_{t}(\delta) - R_{t}(x))^{+} d\Phi_{1t}(x)$ 

- RVs depend on the distributions ⇒ on time!
- Equation (RV) admits a *unique solution* such that e<sup>-rT</sup>R<sub>T</sub>(δ) → 0 This solution is *strictly increasing in* δ, bounded, and absolutely continuous in time and type

- *R<sub>t</sub>*(δ) is strictly increasing in δ
- $\Rightarrow$  An owner at  $\delta_1$  *always* sells to a nonowner at  $\delta_0 > \delta_1$
- ⇒ The distributions of types among owners and nonowners can be solved for independently of RVs!
  - The distribution of types among owners solves

$$\dot{\Phi}_{1t}(\delta) = \gamma \left( \mathbf{sF}(\delta) - \Phi_{1t}(\delta) \right) \qquad \{ x \le \delta \le \mathbf{y} \}$$
  
+ 
$$\int_{\mathcal{D} \times \mathcal{D}} \lambda \left( \mathbf{1}_{\{x \le \mathbf{y} \le \delta\}} - \mathbf{1}_{\{x \le \delta \land \mathbf{y}\}} \right) d\Phi_{1t}(x) d\Phi_{0t}(\mathbf{y})$$
  
= 
$$\gamma \left( \mathbf{sF} - \Phi_{1t} \right) + \lambda \Phi_{1t} \left( 1 - \mathbf{s} - \Phi_{0t} \right)$$

• Quadratic DE since 
$$\Phi_{0t} + \Phi_{1t} = F$$

• Recall  $F_0 = F_t = F$ 

 The equilibrium distribution of types among owners of the asset is explicitly given by

$$\Phi_{1t} = \Phi_1 + \frac{(\Phi_{10} - \Phi_1)\Gamma}{\Gamma + (\Phi_{10} - \Phi_1 - \Gamma)(e^{\lambda\Gamma t} - 1)}$$

and converges to the steady state

$$\begin{split} \Phi_{1} &:= \frac{1}{2}\Gamma - \frac{1}{2}\left(1 - s + \phi - F\right) \\ &= \frac{1}{2}\left(\left(1 - s + \phi - F\right)^{2} + 4s\phi F\right)^{1/2} - \frac{1}{2}\left(1 - s + \phi - F\right) \end{split}$$

with the constant  $\phi := \gamma / \lambda$ 



## **Trading patterns**



## Trading rate



## Trading network

Endogenous density of trading volume



## Conclusion

- Endogenous core-periphery network!
- · But identities of core and periphery change over time
- Can freeze identities by setting  $\gamma = 0$
- · But then the steady state involves no trading
- Can fix this problem by
  - Viewing investors with  $\gamma = 0$  as dealers
  - Introducing customers with time varying types who trade through dealers as in the SC market model
- Delivers a model of Frictional Intermediation

## Frictional intermediation



- Fully tractable setup
- 2 Closed forms for counterparts of key statistics
- 3 Calibrate to trade-level data from the municipal bonds market

#### References

#### 1 Search

DGP (05|07), Vayanos and Weill (08), Lagos and Rocheteau (09), Feldhutter (11), Gavazza (11), Afonso and Lagos (13), Neklyudov (14), Lester-Rocheteau-Weill (15), Üslü (16), Farboodi-Jarosch-Shimer (17), HLW (19,21)

2 Empirics

- Chains: Ashcraft and Duffie (07), LS (18) and HSN (18)
- Trading delays and price dispersion: AD, Gavazza (11), Jankowitsch et al. (11)
- Core-periphery structure: AD, Atalay and Bech (10), LS, AL, Craig and von Peter (14)
- 3 Network and hybrid models
  - Atkeson, Eisfeldt and Weill (15), Colliard and Demange (17)
  - Zawadowski (13), Gofman (14), Babus and Kondor (17), Malamud and Rostek (17), Glode and Opp (16), Farboodi (17)

#### Environment

- Measures 1 of customers and m of dealers
- Homogenous discount rate *r* > 0
- Asset supply  $s \in (m, 1)$
- Agents can hold zero or one unit
- Customers get utility flow  $y \in \{y_L, y_H\}$ 
  - Preference shocks arrive at rate  $\gamma$
  - Conditional on a shock customer type is set to  $y_j$  with probability  $\pi_j$
- Dealers get utility flow  $x \in [\underline{x}, \overline{x}]$
- Continuous cross-sectional distribution F of dealer types
- Focus on steady state

# Trading

- Customer trading:
  - CD|DC contact rate  $\rho$
  - Information need not be incomplete
  - Nash bargaining with dealer bargaining power  $\theta \in (0, 1)$
- Frictional interdealer market:
  - DD contact rate  $\lambda$
  - Assume complete information
  - Nash bargaining with seller bargaining power  $\theta_1 \in (0, 1)$
- $\Rightarrow$  Type distributions
  - Dealers (CDF):  $\Phi_0(x)$  and  $\Phi_1(x)$
  - Customers (masses):  $\mu_{L0}$ ,  $\mu_{H0}$ ,  $\mu_{L1}$ , and  $\mu_{H1}$

#### **Reservation values**

- Denote by W(y) and V(x) the reservation values
- On the *customer* side:

$$rW(x) = y + \gamma \sum_{i} \pi_{i} \left( W(y_{i}) - W(y) \right)$$
  
(sell2D)  $+ \rho \left( 1 - \theta \right) \int_{\underline{x}}^{\overline{x}} \left( V(x) - W(y) \right)^{+} d\Phi_{0}(x)$   
buyfromD)  $- \rho \left( 1 - \theta \right) \int_{\underline{x}}^{\overline{x}} \left( W(y) - V(x) \right)^{+} d\Phi_{1}(x)$ 

- Valid on  $[y_L, y_H]$  not just at  $y_L$  and  $y_H$
- Double feedback from distributions of types and RVs

#### **Reservation values**

• On the dealer side:

$$rV(x) = x + \lambda \int_{\underline{x}}^{\overline{x}} \theta_1 \left( V(x') - V(x) \right)^+ \frac{d\Phi_0(x')}{m}$$
  
(buyfromD)  $-\lambda \int_{\underline{x}}^{\overline{x}} \theta_0 \left( V(x) - V(x') \right)^+ \frac{d\Phi_1(x')}{m}$   
(sell2C)  $+\rho \sum_i \theta \left( W(y_i) - V(x) \right)^+ \mu_{i0}$   
(buyfromC)  $-\rho \sum_i \theta \left( V(x) - W(y_i) \right)^+ \mu_{i1}$ 

- Dealer receive no preference shocks
- Key result: [RV<sub>c</sub>-RV<sub>d</sub>] admits a unique solution that is bounded, Lipschitz, and strictly increasing

## **Trading patterns**



## **Trading patterns**



• Given  $x_0 \le x_1$  the distributions of types solve

$$s = \mu_{L1} + \mu_{H1} + \Phi_1(\overline{x})$$
  

$$0 = \pi_i - (\mu_{i0} + \mu_{i1}) = mF(x) - (\Phi_1(x) + \Phi_0(x))$$
  

$$0 = \Phi_1[\underline{x}, x_0] = \Phi_0[x_1, \overline{x}]$$
  

$$0 = \gamma \pi_L \mu_1 - \gamma \mu_{L1} - \rho \mu_{L1} \Phi_0[x_0, x_1]$$
  

$$0 = \gamma \pi_H \mu_0 - \gamma \mu_{H0} - \rho \mu_{H0} \Phi_1[x_0, x_1]$$
  

$$0 = \rho \mu_{L1} \Phi_0[x_0, \bullet] - \rho \mu_{H0} \Phi_1 - \frac{\lambda}{m} \Phi_1 \Phi_0[\bullet, x_1] \quad \text{on } [x_0, x_1]$$

• The existence of an equilibrium reduces to as a fixed point problem over the pair of constants (*x*<sub>0</sub>, *x*<sub>1</sub>)!

## Equilibrium

• Fixed point problem:

$$\begin{split} \mathbf{x} &= (x_0, x_1) \Longrightarrow \left( \mu_{jq}(\mathbf{x}), \Phi_q(x; \mathbf{x}) \right) \\ & \Longrightarrow \left( V(x; \mathbf{x}), W(y; \mathbf{x}) \right) \\ & \Longrightarrow \hat{x}_1 := \inf \left\{ x : V(x; \mathbf{x}) \ge W(y_H, \mathbf{x}) \right\} \land \overline{x} \\ & \Longrightarrow \hat{x}_0 := \sup \left\{ x : V(x; \mathbf{x}) \le W(y_L, \mathbf{x}) \right\} \lor \underline{x} \end{split}$$

- SSE exists (Brouwer)
- N&S Conditions for intermediation (large  $\theta$ ,  $\rho$ , and  $\Delta$ autarky)
- S Conditions for no dormant dealers (⇒ uniqueness)
- SSE with intermediation is observationally equivalent to one w/o dormant dealers but with endogenous s and m

## **Trading patterns**

- Let  $m_q := \Phi_q(\overline{x})$
- Customers
  - at y<sub>L</sub> sell to dealers with intensity ρm<sub>0</sub>
  - at y<sub>H</sub> buy from dealers with intensity ρm<sub>1</sub>
  - others do not trade
- 2 Dealers at x
  - buy from customers at y<sub>L</sub> with intensity ρμ<sub>L1</sub>
  - buy from dealers at  $x \Delta$  with intensity  $\lambda_0(x) = \lambda \Phi_1(x)/m$
  - Sell to dealers at x + Δ with intensity λ<sub>1</sub>(x) = λ(m<sub>0</sub> − Φ<sub>0</sub>(x))/m
  - Sell to customers at y<sub>H</sub> with intensity ρμ<sub>H0</sub>
- ⇒ Endogenous intermediation chains

### Intermediation chains



Length	Freq. (%)	Markup (%)	Share of Markup (%)					
1	77	1.85	100					
2	13	1.94	43	57	•	•	•	
3	7	2.26	29	23	48	•	•	
4	1	2.92	22	21	19	38	•	
5	0.3	3.26	19	9	25	12	35	

Source: U.S. Municipal bonds, Li and Schürhoff (2018)

## Intermediation chains



Key statistic:

$$\mathbf{P}\left(\{\mathbf{n}=k\}\bigcap_{i=1}^{k}\left\{x^{(k)}\leq z_{k}\right\}\right)=\frac{1}{\chi}\prod_{i=1}^{k}\log\left(\frac{1}{\rho\mu_{H0}+\lambda_{1}(z_{i})}\right)$$

with the constant  $\chi := \lambda_1(x_0) / \rho \mu_{H0}$ 

- n is a truncated Poisson variable with rate χ
- Municipal bond market:  $\mathbb{E}[\mathbf{n}] = 1.34$  implies  $\chi = 0.8618$

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## Municipal bond market



## Calibration

- Exact identification of *s* (supply), *m* (dealers),  $\gamma$ ,  $\pi_H$ ,  $\rho$ , and  $\lambda$
- Calibrate the rest to the average markup, the yield spread, and the beta of markup on chain length
- Along a chain:

bid = 
$$\theta W(y_L) + (1 - \theta) V(x^{(1)})$$
  
ask =  $(1 - \theta) V(x^{(n)}) + \theta W(y_H)$ 

- The model requires a high  $\theta$  to match the markup level
- But then the Diamond paradox kicks in: neither bid ~ W(y<sub>L</sub>) nor ask ~ W(y<sub>H</sub>) depend on the dealer types

### **Demographic targets**

- Six parameters: *s*, *m*,  $\gamma$ ,  $\pi_H$ ,  $\rho$ ,  $\lambda$
- Targets from the municipal bonds market (GHS07|LS18)
  - 1. Supply per capita: 0.2058

Estimate uses trade size, supply, and participation

2. Average chain length: 1.34

Identifies the ratio  $\chi = (\lambda m_0/m)/(\rho \mu_{H0})$ 

- 3. Average inventory duration: 3.3 days Identifies the selling intensities  $\rho\mu_{H0}$  and  $\lambda m_0/m$
- 4. D2C Turnover: 41.1%/Year

Identifies  $m_1$  and the product  $\gamma \pi_H$ 

- 5. Average time for a customer to sell:  $\rho m_0 = 5$  days
- **6**. High type customers are marginal:  $\pi_H = s$

## Calibration

Supply per customer capita	s	0.2058	
Relative size of the dealer sector	т	0.0041	
Type switching intensity	$\gamma$	0.5267	
Probability of a switch to high	$\pi_H$	0.2058	
Intensity of customer-to-dealer contact	ho m	76.87	
Intensity of dealer-to-dealer contact	$\lambda$	78.04	
Customer: time to contact dealer owner	<b>1</b> /(ρ <b>m</b> <sub>1</sub> )	9.303	days
Customer: time to contact dealer non owner	$1/( ho m_0)$	5.000	days
Dealer: time to contact H0 customer	1/( <i>рµ<sub>Н0</sub></i> )	4.303	days
Dealer: time to contact L1 customer	$1/( ho\mu_{L1})$	8.007	days
Dealer: time to contact m0 dealer	$m/(\lambda m_0)$	4.925	days
Dealer: time to contact m1 dealer	$m/(\lambda m_1)$	9.164	days
Assets held in dealer sector	$m_1/s$	0.71%	1%

## Assortative matching

- Heterogeneity among high types customers: y<sub>H</sub> + z with extra flow z drawn from some G upon switching to high type
- Dealers indexed by  $x \in [\underline{x}, \overline{x}]$ 
  - High x dealers match with high z customers
  - Homogenous utility type y<sub>L</sub>
- Dealers at x only sell to  $y_H + z_x$  with  $m_1 F(z_x) = \Phi_1(x)$
- Same trading patterns as in benchmark!
- But V(x) is now much steeper due to the higher flow valuation of customer buyers
- ⇒ No longer require a high bargaining power to match the observed dependence of markups on chain length

## Markup splits

Not targeted in the calibration process

	Extended model					Data								
n	1	2	3	4	5	6	7	1	2	3	4	5	6	7
1	100			•		•	•	100	•		•			•
2	54	46						43	57					
3	46	10	44	•	·	•		29	23	48	•	•		•
4	42	8	8	42		•	•	22	21	19	39		•	•
5	39	6	6	6	41			19	9	25	12	34		•
6	37	5	5	5	5	43	•	17	8	13	24	8	32	•
7	35	5	5	5	5	5	40	17	6	12	14	12	8	31

#### Next time

- Back to a semicentralized market setting but now with incomplete information about investor types
- Myerson-Satherwaite (88): Impossibility theorem
- Two alternative price-setting mechanisms
  - Screening by dealers (TIOLI)
  - Directed (aka competitive) search
- Open problems