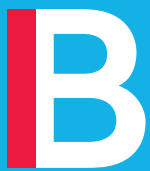


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Lecture 4:

Trade size and market depth



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Readings

Core

- Chapter 4 of textbook

Recommended

- Kyle, Albert S., 1985 Continuous auctions and insider trading, *Econometrica* 53, Sections 1, 2 and 6 only, pp. 1315-1320, 1333-1335 only.

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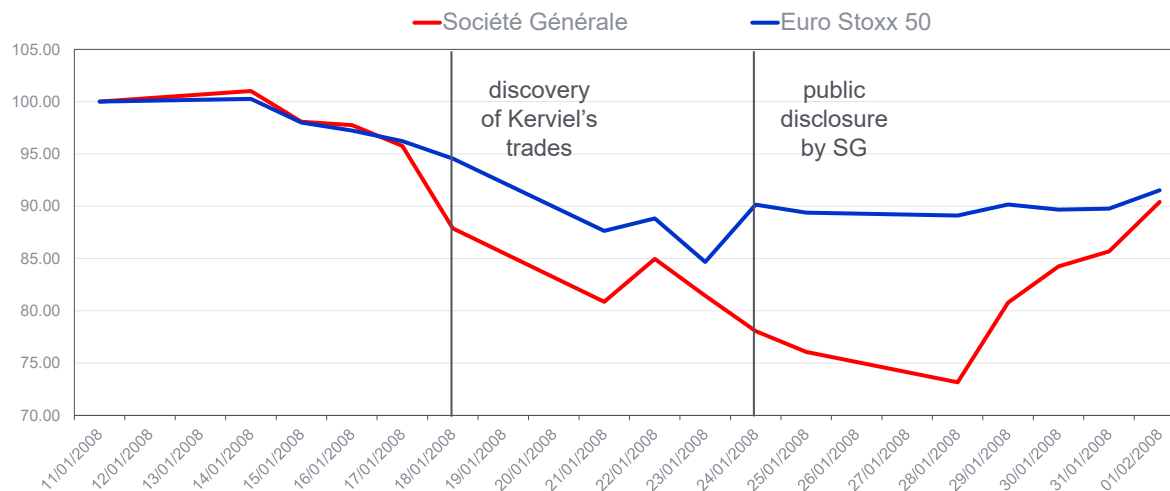
Outline

- How does trade size affect prices?
- What is market depth?
- How do traders choose their trade size?
- We shall address these questions in the context of call markets:
 1. with informative order flow: Kyle's model
 - under perfect and imperfect competition
 2. with risk averse market makers
 - again, under perfect and imperfect competition

Société Générale, January 2008

- Friday 18 January: Société Générale discovers that employee Jerome Kerviel has accumulated massive positions in European equity derivatives \Rightarrow losses = €1.5 bn
- 21 January: bank starts executing small sales
- 22 January: even though sales less than 10% of daily volume, stock markets decline steeply \Rightarrow Fed intervenes
- 24 January: SG discloses the news publicly; its losses = €4.9 bn
- Episode illustrates three facts:
 - large intended trades, yet gradual and cautious sales
 - secrecy, for fear of unsettling market
 - even so, steep price drop: derivative markets have limited depth, even though they are very liquid

Stock price of Société Générale and Euro Stoxx 50 index



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Depth vs. spread: two dimensions of liquidity

- A market can be very liquid for small trades, but not for large ones: "it lacks depth"
- Why?
 - Large orders may be **much more informative** than small ones, being more likely placed by informed traders
 - Filling a large order exposes market makers to **greater inventory risk**: this depends on their total risk bearing capacity (number of market makers also matters)
 - Market makers may have **market power**: if they do, they may offer less depth to large order placers
- To capture these points, we must allow for variable order *size* (not just order *direction*)
- **Depth** = size of order that can be filled at a given deviation of price from its pre-existing level

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Depth and asymmetric information

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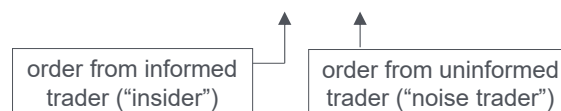
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1. Market depth under asymmetric information

- Model by Kyle (1985): as in Glosten-Milgrom, there are two types of traders:
 - uninformed traders, who place random order $u \sim N(0, \sigma_u^2)$
 - informed traders, who observe $v \sim N(\mu, \sigma_v^2)$ and place order with size (x) that depends on v : $x = X(v)$
- But now orders are not executed one by one. They are batched and submitted as a single net trade q :

$$q \equiv x + u$$



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Market makers

- Risk neutral, competitive market makers:
 - do not observe v , and cannot distinguish x (informed orders) from u (noise)
 - post price-quantity schedules based on expectation of v , conditional on the total net trade q
- They try to infer v from $q = x + u$ or from the price p
- In equilibrium p and q will be linearly related:

$$p = \mu + \lambda q$$

where λ = **price impact** of a market order $\Rightarrow 1/\lambda$ = **depth**

- In equilibrium, λ depends on *order flow informativeness*, which drives dealers' inference about v

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Solving for equilibrium: four steps

- **Market maker's inference:** explain how market makers infer v from orders q , for a *given* (assumed) strategy of informed traders $x=X(v)$
- **Pricing function:** derive the market makers' pricing function $p(q)$, assuming perfect competition among them (zero expected profits)
- **Order placement by informed traders:** find the parameters of the $X(v)$ function that maximize expected profits, for a given pricing function of market makers
- **Nash equilibrium:** find the parameters that make the two best responses $p(q)$ and $X(v)$ mutually consistent

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Market makers' inference

- The insider trades $x = X(v) = \beta(v - \mu)$
for some $\beta > 0$

- Market makers do not observe x , but total demand q :

$$q = x + u = \beta(v - \mu) + u, \quad \text{with } q \sim N(0, \beta^2 \sigma_v^2 + \sigma_u^2)$$

- Their estimate of v is:

$$E(v|q) = \mu + \underbrace{\frac{\text{cov}(v, q)}{\text{var}(q)}}_{\substack{\text{OLS} \\ \text{regression} \\ \text{coefficient}}} q = \mu + \underbrace{\frac{\beta \sigma_v^2}{\beta^2 \sigma_v^2 + \sigma_u^2}}_{\alpha} q$$

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What does order flow informativeness α depend on?

- Informativeness of order flow α is
 - Increasing in σ_v^2 (variance of the "signal")
 - decreasing in σ_u^2 (variance of the "noise")
- It is non-monotonic in β (aggressiveness of trading by insiders): first increasing, then decreasing in β
- Why?
 - aggressive trading by insiders makes their orders more informative
 - it also inflates trades for given $v \rightarrow \alpha$ must be scaled down when insiders' trading is very aggressive

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Perfect competition among market makers

- Zero expected profits for market makers:

$$\boxed{p(q) = E(v|q)} = \mu + \underbrace{\frac{\beta\sigma_v^2}{\beta^2\sigma_v^2 + \sigma_u^2}}_{\lambda = \text{price pressure}} q \quad \boxed{\Rightarrow \lambda = \alpha}$$

- So the call market implicitly features a bid-ask spread that is increasing in the quantity traded:

$$S(q) = 2\lambda q$$

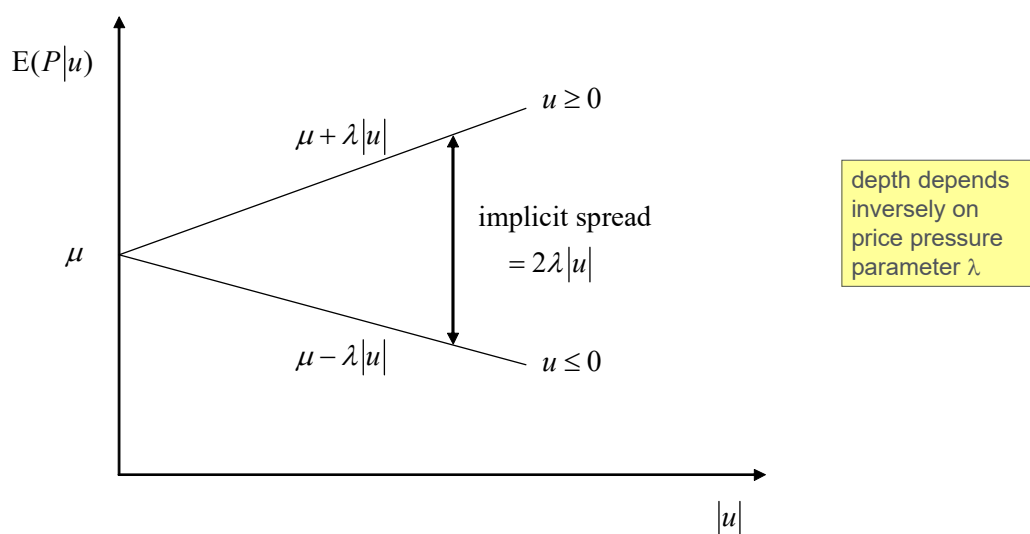
- Note: p depends on **total** order flow $q \Rightarrow$ (i) depth = $1/\lambda$; (ii) execution risk for any given order (as q is random)!

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Expected price and noise trade size



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Endogenous insider behavior

- So far β (intensity of insider's trading) was taken as given
- But the insider chooses x to maximize expected profits:

$$\max_x E[x \cdot (v - p)] = x \cdot (v - (\mu + \lambda E(q | x)))$$

- The first order condition yields the "optimal aggressiveness" β :

$$v - \mu = 2\lambda x = x \cdot (v - (\mu + \lambda x))$$

$$\Rightarrow x = \frac{1}{\underbrace{2\lambda}_{=\beta}} (v - \mu)$$

aggressiveness of insider's orders β is inversely related to price pressure $\lambda \Rightarrow$ it is proportional to market depth $1/\lambda$.

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We derived the best responses of the two players

Market maker set prices:

$$\lambda = \frac{\beta \sigma_v^2}{\beta^2 \sigma_v^2 + \sigma_u^2}$$

The insider responds with:

$$\beta = \frac{1}{2\lambda}$$

The values of β and λ that solve these 2 equations make the best response of the market makers (1st equation) and that of the informed trader (2nd equation) mutually consistent: **Nash equilibrium**

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Solving for the Nash equilibrium

Recall the 2 equations:

$$\lambda = \frac{\beta \sigma_v^2}{\beta^2 \sigma_v^2 + \sigma_u^2}, \quad \beta = \frac{1}{2\lambda}$$

From the 1st eq.:

$$\frac{1}{\lambda} = \frac{\beta^2 \sigma_v^2 + \sigma_u^2}{\beta \sigma_v^2} = 2\beta \text{ by using the 2nd eq.}$$

$$\Rightarrow \beta^2 \sigma_v^2 + \sigma_u^2 = 2\beta^2 \sigma_v^2 \Rightarrow \sigma_u^2 = \beta^2 \sigma_v^2 \Rightarrow \beta = \frac{\sigma_u}{\sigma_v}$$

From the 2nd eq. again:

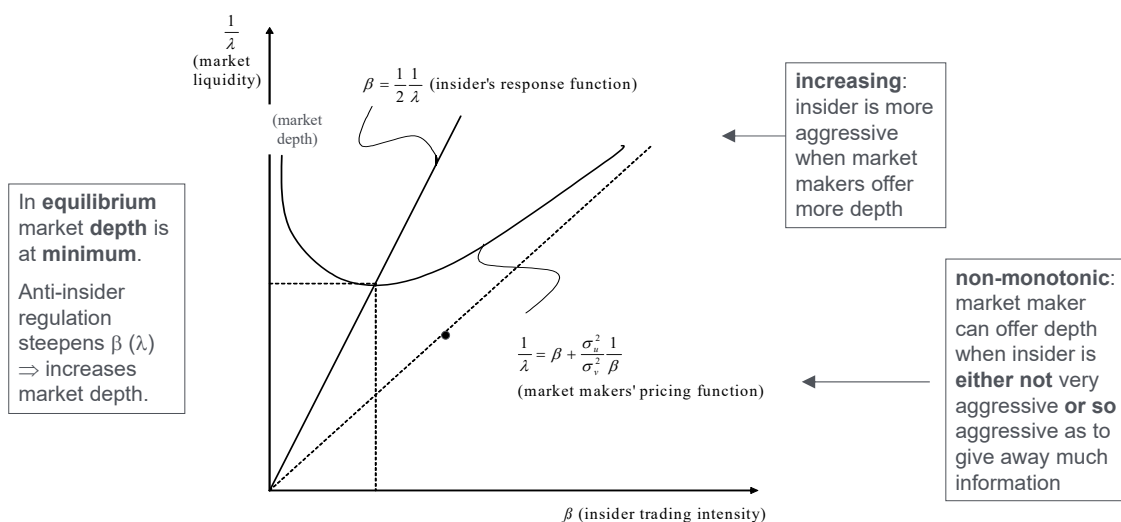
$$\lambda = \frac{1}{2\beta} \Rightarrow \lambda = \frac{\sigma_v}{2\sigma_u}$$

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Graphically

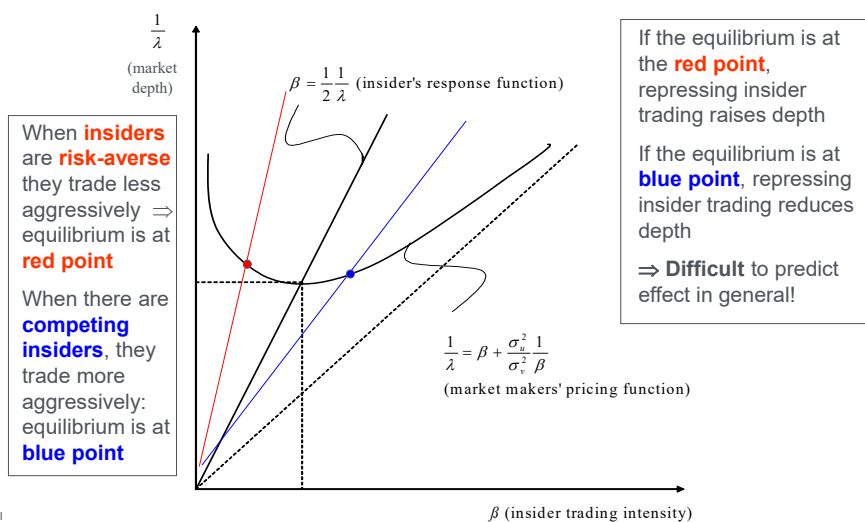


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Other scenarios are possible



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Equilibrium market depth

- The equilibrium value of λ determines the price response to the total net order q :

$$p(q) = \mu + \lambda q = \mu + \frac{\sigma_v}{2\sigma_u} \cdot q$$

- The equilibrium market depth, $1/\lambda = 2\sigma_u/\sigma_v$, is
 - increasing in the variability of noise trading σ_u : the greater noise trading volume, the more market makers earn to compensate losses with insiders
 - decreasing in the variability of the stock value σ_v : the greater the insider's informational advantage, the more market makers are afraid of losing money to insiders

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How much money do insiders make on average?

- Insider's expected profit, *conditional* on v :

$$\begin{aligned} E[x \cdot (v - p) | v] &= x \cdot [v - E(p | x)] = x \cdot [v - (\mu + \lambda x)] \\ &= \underbrace{\beta(v - \mu)}_x \cdot [v - \mu - \underbrace{\lambda \beta(v - \mu)}_{\frac{1}{2}}] \\ &= \frac{1}{2} \beta(v - \mu)^2 = \frac{1}{2} \frac{\sigma_u^x}{\sigma_v} (v - \mu)^2 \end{aligned}$$

- So it is increasing in σ_u (as noise trading allows the insider to “hide”) and in the distance of v from its mean μ (which measures the insider's information advantage)

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Ex ante, how much money do insiders expect to make?

- Consider the insider's expected profit, before he observes the asset value v , that is, unconditionally.
- We must take the expectation of the previous expression over the asset value v :

$$E[x \cdot (v - p)] = \frac{1}{2} \frac{\sigma_u}{\sigma_v} E(v - \mu)^2 = \frac{1}{2} \frac{\sigma_u}{\sigma_v} \sigma_v^2 = \frac{1}{2} \sigma_v \sigma_u$$

- Increasing in σ_v : “information is money”
- Increasing in σ_u : noise trading allows the insider to “hide”
- Insider's expected profit = average noise trader's costs

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Kyle (1985): dynamic case

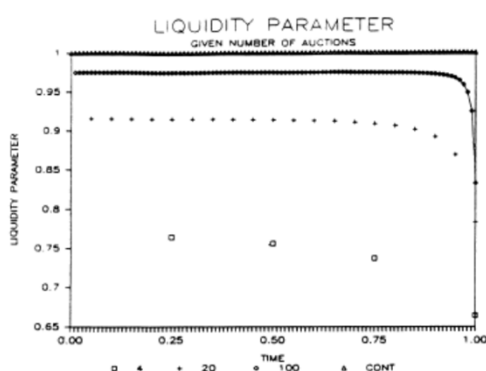
- Suppose that there are two trading rounds.
- Then the informed investor's problem is more complex:
 1. he can repeatedly exploit his signal
 2. however, each trade permanently impacts the price and therefore reduces the profit that the informed investor can expect from future trades
- Solving the equilibrium: $\{\beta_t\}$, $\{\lambda_t\}$ are jointly determined at each date (no recursive solution)

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Key findings for the dynamic case



Kyle (1985) shows that, in discrete time, illiquidity

- decreases over time
- increases as the number of trading rounds increases

Instead, in continuous time, illiquidity is constant at each date

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Market Depth and Imperfect Competition

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Imperfectly competitive market making

- Now consider a call auction where K risk neutral market makers compete by submitting supply schedules $y^k = Y^k(p)$, for $k = 1, \dots, K$
- Look for rational expectations equilibrium, i.e.:
 - market makers maximize expected profits, given their beliefs about the security's value, and the (assumed) behavior of (i) the informed trader *and* (ii) their competitors
 - their beliefs are rational (=verified in equilibrium)
 - the market clears

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Updating and market clearing conditions

- As before, assume that the order flow q is informative about the value of the security v :

$$E(v|q) = \mu + \alpha q$$

- The market clears when the market makers' total supply equals the customers' order flow q :

$$\sum_{k=1}^K Y^k(p) = q$$

- Note that by conditioning on p , each market maker can effectively condition on q

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Imperfectly competitive equilibrium

- Derive the optimal (profit-maximizing) response of market maker k , assuming that each competitor j submits an *identical linear* supply function:

$$y^j = Y^j(p) = \phi(p - \mu)$$

- Market maker k 's optimal response $y^k = Y^k(p)$ also depends on his estimate $E(v|q)$
- In equilibrium, the slope of y^k must equal the slope ϕ assumed for his competitors, which yields:

$$p = \mu + \underbrace{\alpha \frac{K-1}{K-2}}_{\lambda} q$$

Note that:

$$\frac{K-1}{K-2} > 1$$

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Imperfectly competitive equilibrium (2)

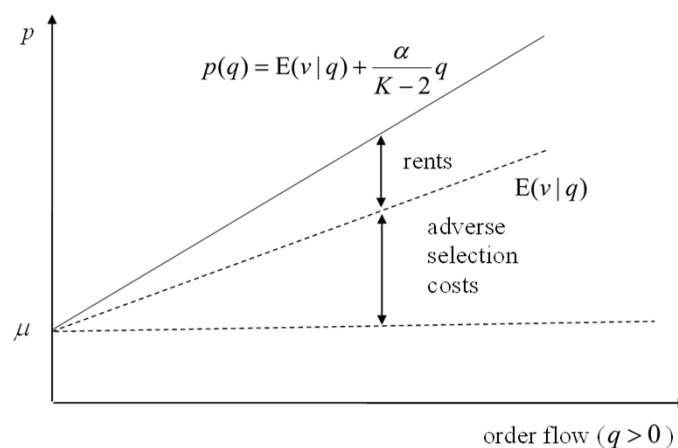
- So under imperfect competition the price “overreacts” to the order flow relative to perfect competition:

$$p = \underbrace{\mu + \alpha q}_{\text{competitive price} = E(v|q)} + \underbrace{\frac{1}{K-2} \alpha q}_{\text{markup}} \quad \Rightarrow \lambda > \alpha$$

- The markup is positive for $K > 2$ and is inversely related to the number of competing market makers K
- The markup goes to 0 as K goes to ∞ : perfect competition!

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Dealers' quotes: perfect vs. imperfect competition



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2. Market depth with risk averse market makers

- K risk averse market makers $k = 1, \dots, K$, with utility:

$$E[U(w^k)] = E(w^k) - \frac{\bar{\rho}}{2} \text{var}(w^k)$$

and budget constraint:

$$w^k = \underbrace{v(z^k - y^k)}_{\text{final inventory}} + \underbrace{py^k + c^k}_{\text{final cash}}$$

stock supply

initial cash

initial inventory

final wealth

- The security has value with mean μ and variance σ_v^2
- Each market maker posts a net supply schedule
- He is **competitive**, i.e. takes p as given

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Individual optimization

- Market maker k chooses y^k so as to maximize his utility under the budget constraint. Replace the constraint in $E[U(w^k)]$:

$$\mu(z^k - y^k) + py^k + c^k - \frac{\bar{\rho}}{2} \sigma_v^2 (z^k - y^k)^2$$

and compute the first order condition:

$$p - \mu + \bar{\rho} \sigma_v^2 (z^k - y^k) = 0$$

- So the individual supply function of market maker k is:

$$y^k = \frac{p - \mu}{\bar{\rho} \sigma_v^2} + z^k$$

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Competitive equilibrium

- The market clearing condition is:

$$\sum_{k=1}^K y^k = q$$

- So the equilibrium price is:

$$p = \mu - \rho \sigma_v^2 Z + \rho \sigma_v^2 q$$

where

$$Z = \sum_{k=1}^K z^k \quad \text{and} \quad \rho = \frac{\bar{\rho}}{K}$$

the “risk aversion of the market” is inversely related to number of dealers K : each supplies $1/K$ of q

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Competitive equilibrium (2)

- Since

$$p = \underbrace{\mu - \rho \sigma_v^2 Z}_{\text{midquote } m} + \rho \sigma_v^2 q = m + \rho \sigma_v^2 q$$

the trading cost $p - m$ is increasing in the

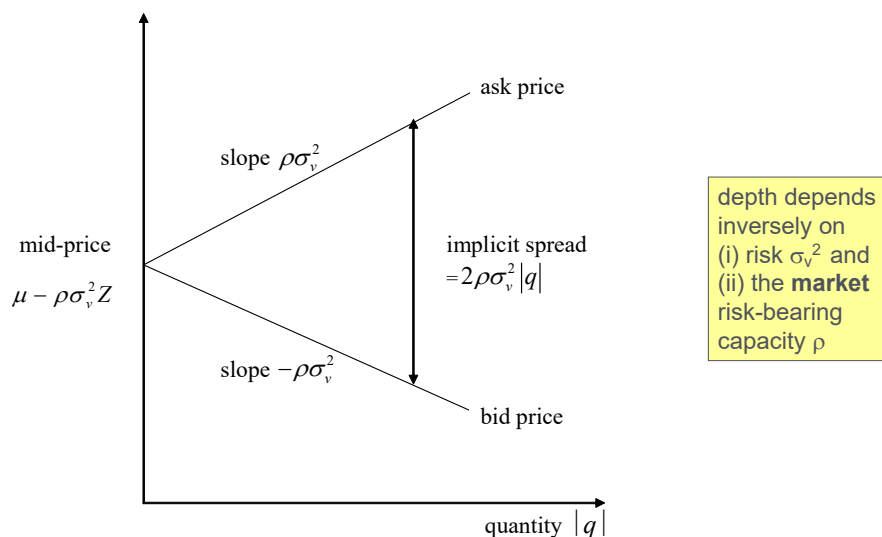
- risk of the security
- size of total net trade q
- market makers’ “collective” risk aversion $\rho \Rightarrow$ decreasing in their number K (= risk bearing capacity of the market)

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Graphically



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Imperfectly competitive dealers

- Suppose dealers are (i) imperfectly competitive; (ii) equally risk averse
- There is Nash equilibrium in which each dealer k submits the following supply function, assuming that his competitors submit *identical linear* supply functions:

$$y^k = Y^k(p) = \phi(p - \mu) + \psi z^k$$

- Market maker k 's optimal response y^k takes into account that the price responds to his supply y^k in equilibrium:

$$y^k + \underbrace{(K-1)\phi(p - \mu) + \psi \sum_{j \neq k} z^j}_{\text{supply by } k\text{'s competitors}} = q$$

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Deriving the Nash equilibrium: three steps

1. Dealer k maximizes his mean-variance objective *considering the response of the equilibrium price to his trade* \Rightarrow obtain his **supply function** (best response) $Y^k(p)$
2. By **symmetry** the coefficients of dealer k 's supply must **equal** those of his competitors' (conjectured) supplies \Rightarrow obtain his **Nash equilibrium supply** function:

$$Y^k(p) = \frac{K-2}{K-1} \left[\frac{p - \mu}{\bar{\rho}\sigma_v^2} + z^k \right]$$

3. Impose **market clearing**:

$$\sum_{k=1}^K Y^k(p) = q$$

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Nash equilibrium price

- Equilibrium price (for $K > 2$):

$$p = \mu - \rho\sigma_v^2 Z + \frac{K-1}{K-2} \rho\sigma_v^2 q$$

$= 1 + \frac{1}{\underbrace{K-2}_{\text{markup}}}$

where

$$Z = \sum_{k=1}^K z^k \quad \text{and} \quad \rho = \frac{\bar{\rho}}{K}$$

- So the price “overreacts” to the order flow compared to perfect competition (case where $K \rightarrow \infty$)
- The markup is inversely related to the number of competing market makers K
- Here K adds to market depth for 2 reasons: 1) more risk bearing capacity; 2) more competition

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Risk sharing in the competitive case

- How do dealers share risk? Do they share risk efficiently?
- Suppose $q=0$. If all dealers have the same risk aversion, efficient risk sharing requires each to have a final position Z/K : so risk is shared equally among dealers
- This is indeed the case in the competitive equilibrium since after trading, a dealer's position is:

$$z^k - y^k(p^*) = \frac{Z}{K}$$

- This yields a Pareto optimal allocation among dealers after trading \Rightarrow no need for re-trading

Risk sharing in the imperfectly competitive case

- In a non-competitive equilibrium, a dealer's position after trading is a weighted average of his initial position z^k and Z/K :

$$z^k - y^k(p^*) = \frac{1}{K-1} z^k + \frac{K-2}{K-1} \frac{Z}{K}$$

- So risk allocation after one trading round is not Pareto- optimal
- Why? Dealers trade "too little": they reduce their supply or demand so as to limit the adverse price reaction they trigger
- If the market reopens, they would want to trade again after the first trading round

Key takeaways

- Large orders generally affect prices more than small orders: markets can offer great liquid for small trades but lack depth
- The price impact of large orders is an inverse measure of market depth
- Depth is lower
 - the more informative is the order flow, i.e., the higher the signal to noise ratio
 - the greater is asset risk and market makers' risk aversion, and the lower their number
 - the greater is the market power of liquidity suppliers, and thus (again) the fewer they are