

Increasing Corporate Bond Liquidity Premium and Post-Crisis Regulations

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June 10, 2022

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- ▶ Existing studies look at the *transaction costs*.
- ▶ **This Paper: if liquidity has deteriorated after the crisis, investors should require a higher premium for holding illiquid bonds.**

I. Empirical Method

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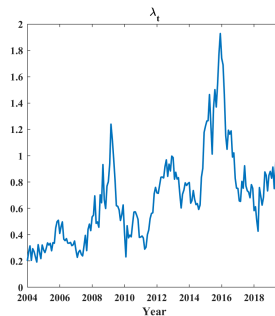
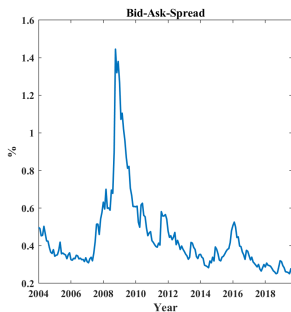
Monthly cross-sectional regression (Dick-Nielsen, Lando, Feldhütter 2012): Theory

$$\text{Yield-Spread}_{it} = \underbrace{\lambda_t \times \text{Bid-Ask-Spread}_{it}}_{\text{Liquidity Premium}} + \gamma_t' \text{Bond-and-CreditControls}_{it} + \epsilon_{it}$$

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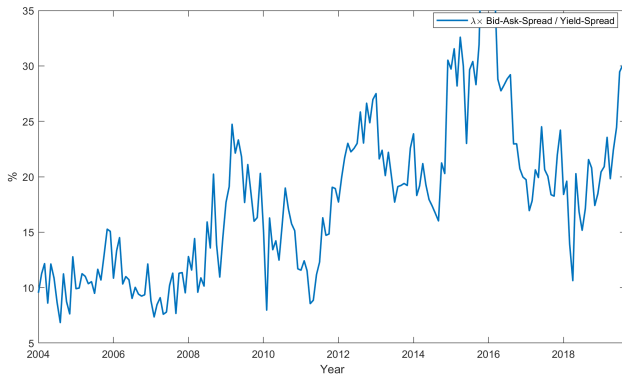
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The left panel is the aggregate bid-ask spread.
The right panel is λ_t .

I. Liquidity Premium has increased

- ▶ Liquidity premium ($\lambda \times \text{Bid-Ask-Spread}$) has also increased:



- ▶ Over 20% of the credit spread is now due to illiquidity compared to 10% before the crisis.
- ▶ From liquidity premium's perspective it is consistent with practitioner's observation that liquidity has gone *worse!*

I. Liquidity Premium has increased: variations across different episodes

▶ average $\lambda_t \times Bid-Ask-Spread_{it} / Yield-Spread_{it}$.

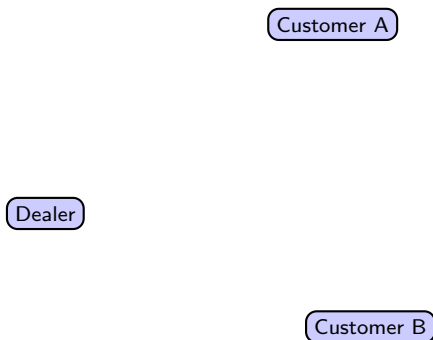
Rating	A and above	BBB	Speculative
Crisis – Pre-Crisis	14.673*** (3.48)	1.813 (0.72)	-0.473 (-0.35)
Post-Crisis – Crisis	0.309 (0.07)	3.425 (1.42)	-1.347 (-0.79)
Basel II.5 – Post-Crisis	-5.344 (-1.64)	2.604** (2.08)	14.763*** (6.06)
Basel III – Basel II.5	-8.210** (-2.20)	-2.848*** (-2.63)	3.719 (1.37)
Post-Volcker – Basel III	-1.401 (-0.64)	-0.947 (-0.77)	4.970* (1.90)
Post-Volcker – Pre-Crisis	0.028 (0.02)	4.047*** (2.70)	21.633*** (11.13)

▶ average $\lambda_t \times Bid-Ask-Spread_{it}$.

Rating	A and above	BBB	Speculative
Post-Volcker – Pre-Crisis	0.014 (0.92)	0.116*** (2.88)	0.987*** (7.01)

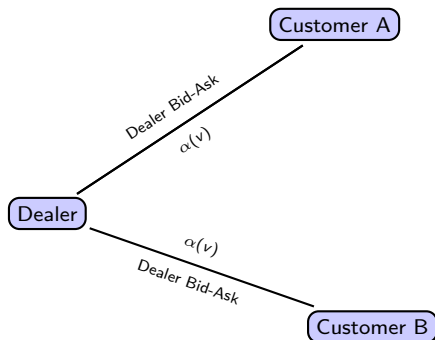
II. Low Bid-Ask Spread vs High Liquidity Premium: Model of **Trading Delays**

- ▶ Duffie, Garleanu and Pedersen (2005), Lagos and Rocheteau (2009).
- ▶ Dealer cost k affects the market making v .



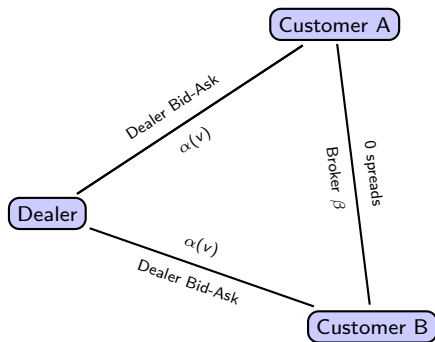
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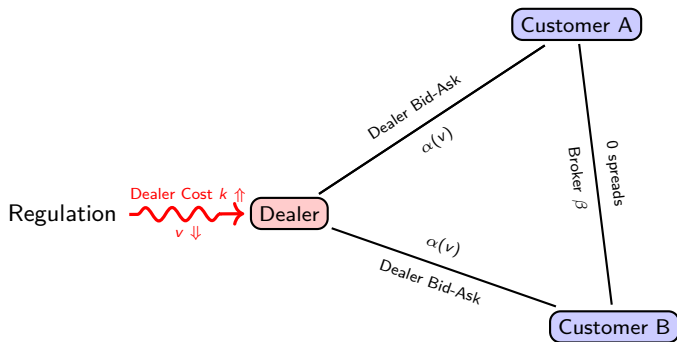
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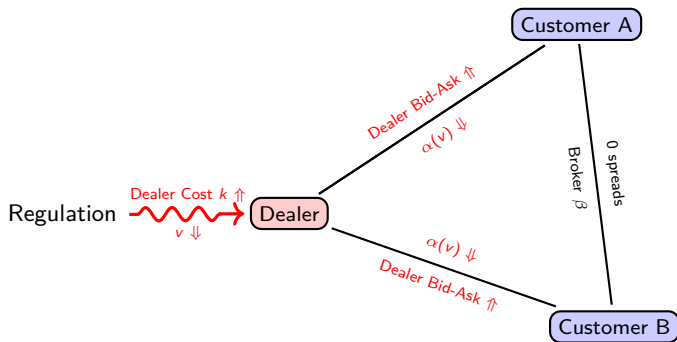
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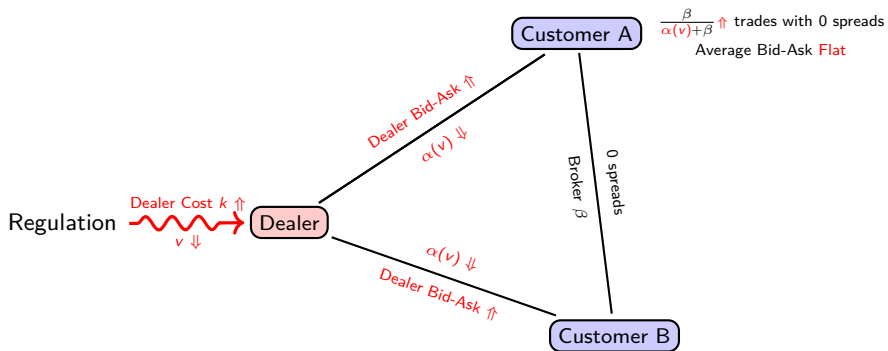
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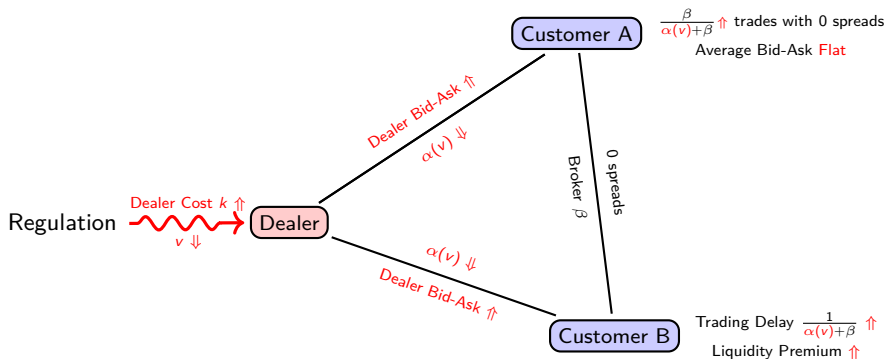
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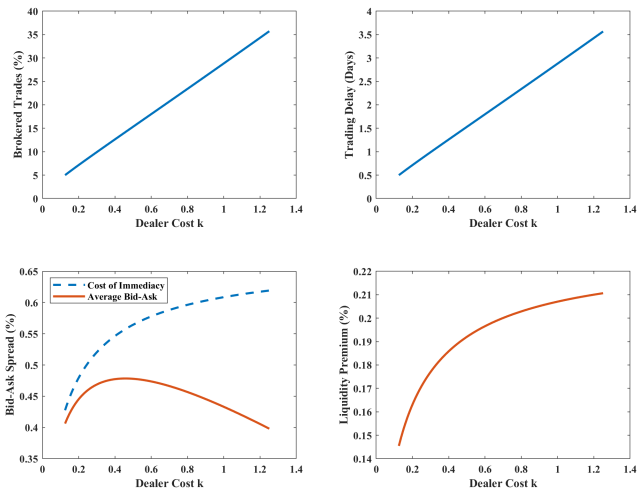


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II. Model generated statistics (Time Series)



Notes: Calibration is based on Feldhütter (2012) and the average BBB-rated bond.

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or in terms of the total credit spread: Regression Model

$$y^m - r^m = \underbrace{\lambda \frac{BA^m}{p^m}}_{\text{Liquidity Premium}} + \underbrace{\lambda_D^m}_{\text{Default Premium}} \quad (1)$$

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- ▶ Can show model-generated λ increases over time as $k \uparrow$: $\frac{\partial \lambda}{\partial k} = \frac{\partial \lambda}{\partial v} \frac{\partial v}{\partial k} > 0$

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- ▶ Illiquidity has 2 dimensions:

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$$LP^m = \frac{BA^m}{p^m} \times \lambda : \text{Transaction-Cost} \times \text{Delay}$$

- ▶ But trading delays are not directly observable in the realized transaction-level data...

II. Estimation of (Unobserved) Trading Delays

- ▶ Estimate trading delay every month, $\frac{1}{\alpha_t + \beta_t}$, by targeting the moment of liquidity premium LP :

$$\min_{\alpha_t, \beta_t} \sum_m [LP_t^m - \widehat{LP}_t^m]^2.$$

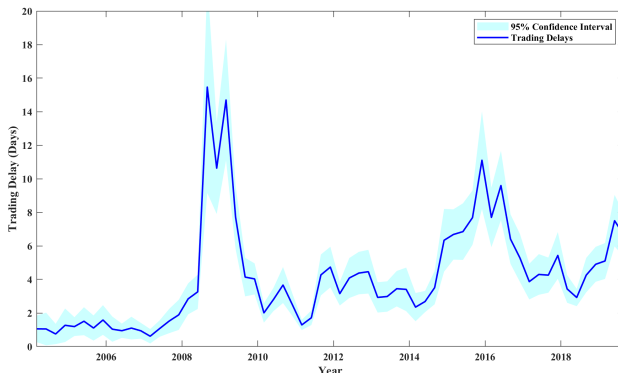
LP_t^m is the liquidity premium of bond m at time t in the data.

\widehat{LP}_t^m is the model-implied liquidity premium by substituting in the default λ_{Dt}^m , maturity λ_{Tt}^m and riskless yield r_t^m of bond m in month t .¹

¹Identification is achieved by the parameter restrictions using $\frac{\beta}{\alpha + \beta}$ or λ .

II. Model-Implied (Unobservable) Trading Delays

Figure Trading Delays

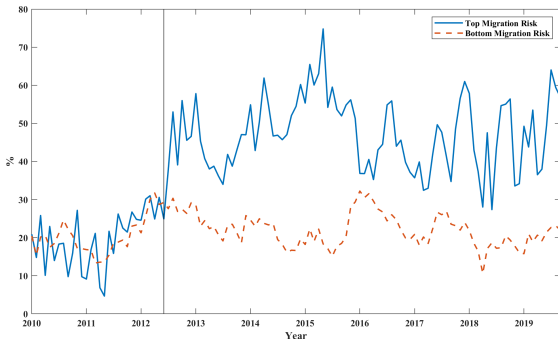


Notes: The shaded area is the 95% confidence interval of the estimated trading delays based on the asymptotic normality and the delta method.

- ▶ Goldman Sachs Global Investment Research: "trade that historically may have taken a day to get done now needs to [...] take a week or two to execute".

III. Impact of Regulations: Basel II.5

- ▶ Introduced in June 2012. Incremental risk charge and SVaR account for default and migration risk for credit products.
- ▶ According to a BIS survey, Basel II.5 was seen to have the largest impact on bond liquidity (CGFS 2016).
- ▶ Use bond yield volatility to proxy migration risk and risk charges.

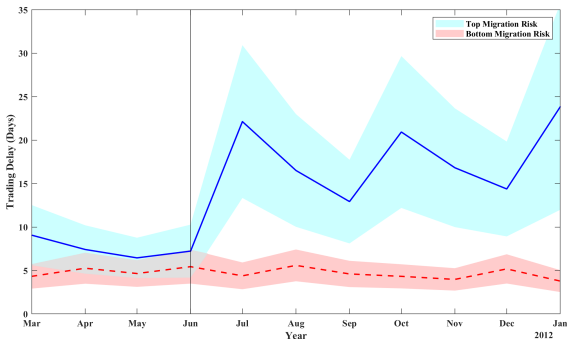


Liquidity premium (as a fraction of yield spread) of the bonds in the top and bottom of the credit migration risk distribution, proxied by the yield volatility each month. The vertical line is June 2012 (Basel II.5).

III. Impact of Regulations: Basel II.5

- ▶ Translate the impact into the unobserved trading delays:

Figure Basel II.5 and Trading Delays



Trading delays of the bonds in the top and bottom of the Basel II.5 risk charge each month, proxied by the corporate bond yield change volatility. The shaded area is the 95% confidence interval of the estimated trading delays. The vertical line is June 2012 (Basel II.5).

Literature and Contributions

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- ▶ Investor demand and bond liquidity: Electronic Trading (O'Hara and Zhou 2021); ETF (Shim and Todorov 2021); Mutual Funds (Li and Yu 2021).
 - ▶ I focus on the **dealer liquidity supply**, and the rising trading delays and liquidity premium.

Dick-Nielsen and Rossi (2018): *"Discouraging air travel might well lower the actual realized cost of transportation (taking the bus is cheaper) [...] Traveling from Los Angeles to New York in 3 days by bus is not the same as completing the trip in 5 hours by plane."*

- ▶ Reconcile the puzzle of low bid-ask spread vs. lack of liquidity; Propose alternative liquidity measures: liquidity premium (trading delays).
- ▶ Build an OTC model that bridges the unobservable trading delays, and the easily-measurable liquidity premium.
- ▶ Use liquidity premium and trading delays to understand the impact of regulations on market liquidity.

Thank You!