

# Corporate Bond Liquidity during the COVID-19 Crisis

---

Mahyar Kargar<sup>1</sup> Ben Lester<sup>2</sup> David Lindsay<sup>3</sup> Shuo Liu<sup>4</sup> Pierre-Olivier Weill<sup>3</sup>  
Diego Zúñiga<sup>3</sup>

August 27, 2020

The views expressed here do not necessarily reflect the views of the Federal Reserve Bank of Philadelphia or the Federal Reserve System

<sup>1</sup>UIUC

<sup>2</sup>FRB Philadelphia

<sup>3</sup>UCLA

<sup>4</sup>Tsinghua

# Background & Motivation

- The corporate bond market in mid-Mar was “basically broken”
  - [Credit spread](#), [customer-to-dealer volume](#), fund outflows
- The Fed announced unprecedented actions in late March (MMLR)
  - PDCF, PMCCF & SMCCF
- **This paper:**
  - Study liquidity conditions & impact of Fed interventions
  - Consider both *cost* & *quality* (speed) of intermediation services
  - Simple model that guides of empirical work
  - Implications of demand surge for consumer surplus & dealer profits

# Main findings

- Dealers reluctant to absorb bonds onto balance sheets
  - Price of fast (risky-principal) trades go up substantially
  - Customers respond: **substitute** towards slower (agency) trades
  - During worst of crisis, dealers were **net sellers**
- Fed's interventions: significant improvement in liquidity conditions
  - Immediately after announcement: for eligible bonds only
  - Later after expansion: for a wide range of bonds
- Distinction between cost & quality matters for welfare
  - Consumer surplus still depressed (lower quality)
  - Dealer profits returned to pre-COVID levels (elevated volume)

- Post-GFC regulation and bond market liquidity
  - Bessembinder-Jacobsen-Maxwell-Venkataraman (18)
  - Bao-O'Hara-Zhou (18), Dick-Nielsen-Rossi (18), Choi-Huh (18)
- COVID-19 crisis in fixed income markets
  - [Boyarchenko-Kovner-Shachar \(20\)](#), [Chen-Liu-Sarkar-Song \(20\)](#), [Duffie \(20\)](#), [Ebsim-Faria-e-Castro-Kozlowski \(20\)](#), [Falato-Goldstein-Hortaçsu \(20\)](#), [Fleming-Ruela \(20\)](#), [Foley-Fisher-Gorton-Verani \(20\)](#), [Haddad-Moreira-Muir \(20\)](#), [He-Nagel-Song \(20\)](#), [Ma-Xiao-Zeng \(20\)](#), [Mizrach-Neely \(20\)](#), [O'Hara-Zhou \(20\)](#)

# Two types of transaction services: both cost & quality matter

- “Agency” (“pre-arranged” or “riskless-principal”) trades
  - customers trade only after a suitable counterparty located
  - for a customer: **low-quality** transaction b/c customer has to wait
  - for a dealer: **low-cost** transaction b/c doesn't use balance-sheet capacity (matchmaker)
- “Risky-principal” trades
  - customers trade immediately against dealer inventory
  - for a customer: **high-quality** transaction b/c provides immediacy
  - for a dealer: **high-cost** transaction b/c uses balance-sheet capacity

# A simple model

---

# Customers and dealers

- A measure  $N$  of customers, each has unit demand for transactions
- Demand low- and high-quality transaction services

$$\max_{(x_l, x_h)} u(x_l, x_h) - p_l x_l - p_h x_h \quad \text{s.t.} \quad x_l + x_h = 1$$

- A representative competitive dealer supplies transaction services

$$\max_{(X_l, X_h)} p_l X_l + p_h X_h - C(X_l, X_h)$$

- Market clearing:  $N x_l = X_l$  and  $N x_h = X_h$

# COVID-19 as exogenous shock to transaction demand

- Suppose the **aggregate** demand for transaction services goes up
    - the measure of customers arriving to the market,  $N$ , goes up
    - assume no contemp. supply shock
  - What happens to  $p_l, p_h$ ?
  - We find that, under natural conditions:
    - the cost of *all* transactions go up: both  $p_l$  and  $p_h$  increase
    - the cost of *high-quality* transaction goes up by more:  $p_h - p_l$  increases
    - customers *substitute* towards low-quality transactions:  $x_h$  decreases
- ▶ Econ 101 plots
- If Fed intervention relaxes dealer balance sheet capacity (reducing  $C$ )
    - it should mitigate these changes



# Empirical observations

---

# Measuring the cost of *agency* (low-quality) trades

Measurement based on Feldhüter (12) “Implied Roundtrip Cost”

transaction cost = spread of roundtrip trades lasting  $< 15$  min

- Dealers search for counterparties on behalf of customers
- So, when two CD trades happen in quick succession
  - likely an agency trade
  - as argued by Li-Schürhoff (19) and others

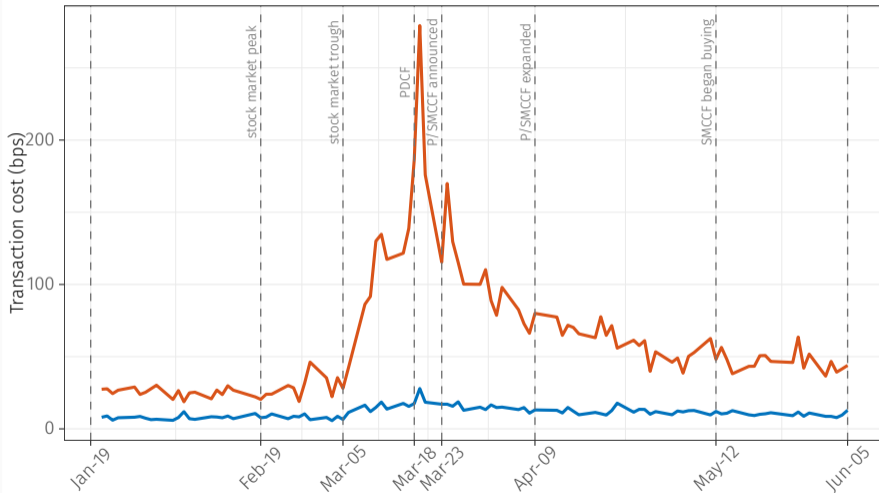
# Measuring the cost of *risky-principal* (high-quality) trades

Measurement based on Choi-Huh (18)

$$\text{transaction cost} = 2Q \times \frac{\text{trade price} - \text{reference price}}{\text{reference price}}$$

- $Q = +1$  for customer-buy and  $Q = -1$  for customer-sell
  - excluding previously identified agency trades
- “reference price”:
  - volume-weighted price of interdealer trades in same bond/day

# Trading costs for high & low-quality: Jan-Jun



▸ diff

▸ time FEs

▸ regression

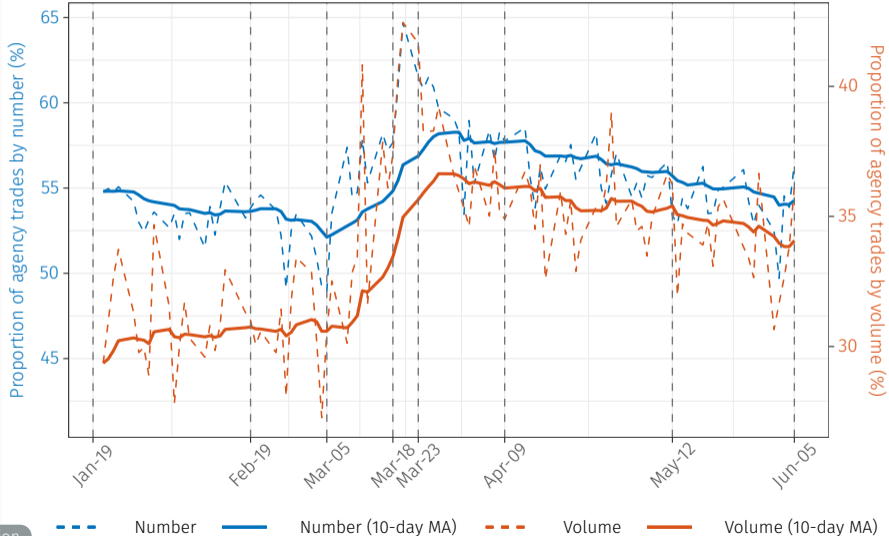
—

Risky-Principal (high-quality)

—

Agency (low-quality)

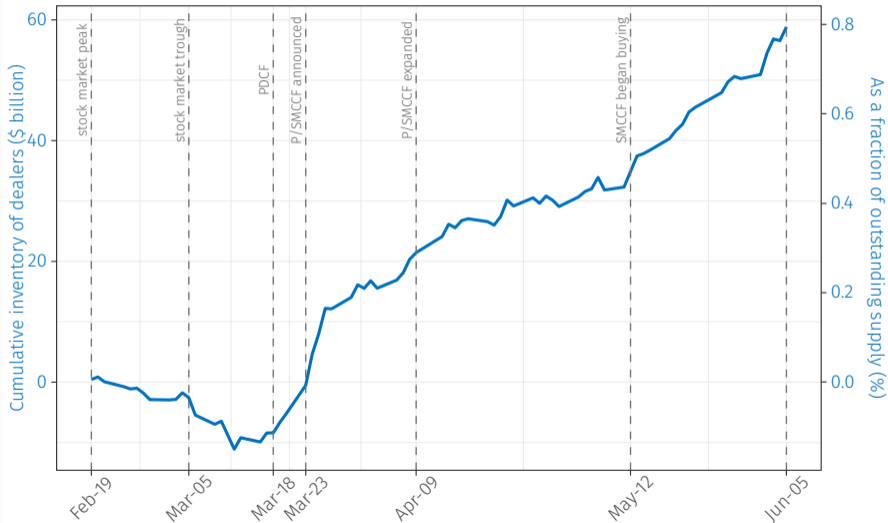
# Substitution from high- to low-quality transactions



Who provided liquidity in  
mid-March?

---

# Dealers did NOT “lean against the wind”! (until late March)



# Effect of the Fed's intervention

---



# Eligible vs. ineligible bonds for the SMCCF

- On 03/23, the Fed specified it would purchase U.S. bonds that have:
  - an IG rating (at least BBB– / Baa3)
  - a remaining maturity of  $\leq 5$  years
  - other criteria (not received CARES Act support, non-depository, ...)
- **Question:**
  - Did the intervention improve eligible bond liquidity by more?
- **Empirical strategy:**
  - Diff-in-diff on U.S. bonds; before/after SMCCF announcement

## Spillover effects?

$$y_{ijt} = \alpha_i + \alpha_s + \beta_1 \times \text{Crisis}_t + \beta_2 \times \text{SMCCF}_t + \beta_3 \times \text{SMCCF Expansion}_t + \varepsilon_{ijt}$$

- $y_{ijt}$ : transaction cost (agency or risky-principal)
- $\alpha_i$  and  $\alpha_s$ : bond and size category FEs
- $\text{Crisis}_t$ : dummy for Mar 5–Mar 23
- $\text{SMCCF}_t$ : dummy for Mar 23–Apr 9
- $\text{SMCCF Expansion}_t$ : dummy for after Apr 9
- Eligible = IG  $\times$  (TTM  $\leq$  5 yr)

# Spillovers of Fed facilities to ineligible bonds

|                        | <i>Dependent variable:</i>  |                      |                      |                    |                    |                    |
|------------------------|-----------------------------|----------------------|----------------------|--------------------|--------------------|--------------------|
|                        | Risky-Principal             |                      |                      | Agency             |                    |                    |
|                        | All<br>(1)                  | Eligible<br>(2)      | Ineligible<br>(3)    | All<br>(4)         | Eligible<br>(5)    | Ineligible<br>(6)  |
| Crisis                 | 105.64***<br>(14.96)        | 111.67***<br>(15.62) | 102.16***<br>(15.65) | 11.92***<br>(2.16) | 16.32***<br>(3.52) | 9.64***<br>(1.80)  |
| SMCCF                  | 88.96***<br>(8.38)          | 62.14***<br>(8.68)   | 104.30***<br>(9.42)  | 14.35***<br>(1.15) | 11.78***<br>(1.26) | 15.98***<br>(1.49) |
| SMCCF Expansion        | 31.15***<br>(3.14)          | 15.35***<br>(3.08)   | 40.16***<br>(4.28)   | 7.20***<br>(1.01)  | 4.56***<br>(0.98)  | 9.08***<br>(1.44)  |
| Bond FE                | Yes                         | Yes                  | Yes                  | Yes                | Yes                | Yes                |
| Trade size category FE | Yes                         | Yes                  | Yes                  | Yes                | Yes                | Yes                |
| Observations           | 580,698                     | 200,761              | 379,937              | 146,864            | 50,192             | 96,672             |
| Adjusted $R^2$         | 0.18                        | 0.19                 | 0.18                 | 0.27               | 0.21               | 0.27               |
| <i>Note:</i>           | *p<0.1; **p<0.05; ***p<0.01 |                      |                      |                    |                    |                    |

# The effect of Fed's interventions: Diff-in-diff

$$y_{ijt} = \alpha_s + \alpha_k + \beta_1 \times \text{SMCCF}_t \times \text{Eligible}_t + \beta_2 \times \text{SMCCF}_t \\ + \beta_3 \times \text{Eligible}_t + \gamma \times X_{i,t} + \varepsilon_{ijt},$$

- $y_{ijt}$ : transaction cost (agency or risky-principal)
- $\alpha_s$  and  $\alpha_k$ : size category and industry FEs
- $X_{it}$ : control for bond characteristics
- focus on bonds with no change in rating
- focus on trades before April 9 expansion to fallen angels

# The effect of Fed's intervention: March 6–April 9

|                  | <i>Dependent variable:</i> |                      |                     |                   |
|------------------|----------------------------|----------------------|---------------------|-------------------|
|                  | Risky-Principal            |                      | Agency              |                   |
|                  | (1)                        | (2)                  | (3)                 | (4)               |
| SMCCF × Eligible | −57.67***<br>(11.80)       | −47.33***<br>(10.21) | −10.30***<br>(2.99) | −9.58**<br>(3.44) |
| SMCCF            | −1.90<br>(14.59)           | −14.20<br>(14.68)    | 6.36***<br>(2.00)   | 4.56**<br>(1.98)  |
| Eligible         | 2.44<br>(14.27)            |                      | 0.48<br>(3.17)      |                   |
| Bond controls    | Yes                        | No                   | Yes                 | No                |
| Bond FE          | No                         | Yes                  | No                  | Yes               |
| Trade size FE    | Yes                        | Yes                  | Yes                 | Yes               |
| Industry FE      | Yes                        | No                   | Yes                 | No                |
| Observations     | 158,647                    | 158,649              | 47,628              | 47,630            |
| Adjusted $R^2$   | 0.04                       | 0.20                 | 0.08                | 0.25              |

Note:

\* $p < 0.1$ ; \*\* $p < 0.05$ ; \*\*\* $p < 0.01$

# Welfare implications

---

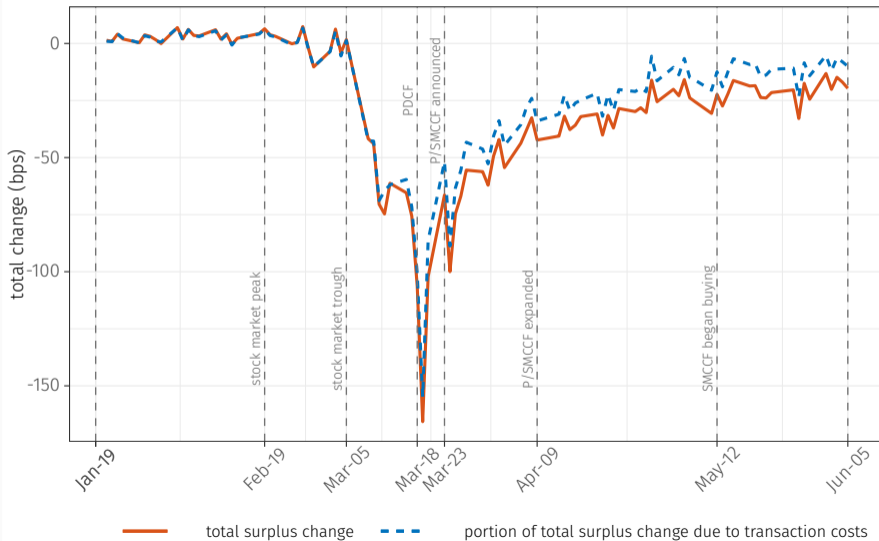
# Change in consumer surplus

- Consumer surplus:  $s_t = u(x_{lt}, x_{ht}) - p_{lt}x_{lt} - p_{ht}x_{ht}$
- Change in surplus

$$ds_t = \underbrace{-d(p_{lt}x_{lt} + p_{ht}x_{ht})}_{\Delta \text{ transaction cost}} + \underbrace{(p_{ht} - p_{lt}) dx_{ht}}_{\Delta \text{ quality}}$$

- Increase in transaction costs alone, *underestimates* loss in surplus
  - ignores loss due to *substitution* towards lower-quality transactions

Change in consumer surplus:  $s_t - s_0 = \int_0^t ds_u$  (per \$ unit of transaction)





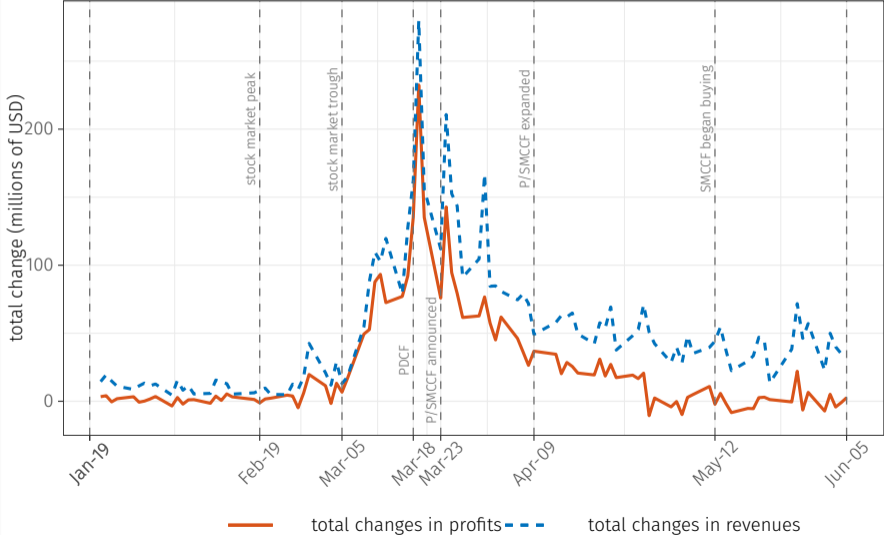
# Dealer profits

- Dealer profits:  $\Pi_t = N_t (p_{lt}x_{lt} + p_{ht}x_{ht}) - C(Nx_{lt}, Nx_{ht})$ ,
- Change in dealer profits:  $d\Pi_t = -N_t ds_t$
- Dealer revenues:  $R_t = N_t (p_{lt}x_{lt} + p_{ht}x_{ht})$
- $d\Pi$  differs from  $dR$  due to

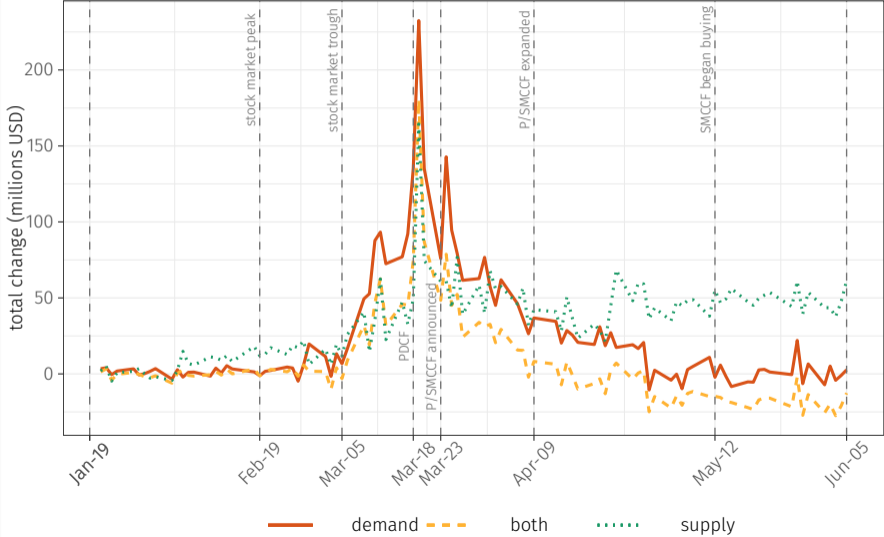
$$d\Pi_t = dR_t \underbrace{-dN_t (p_{lt}x_{lt} + p_{ht}x_{ht})}_{\text{volume effect (<0)}} \underbrace{-N_t (p_{ht} - p_{lt}) dx_{ht}}_{\text{substitution effect (>0)}}$$

- The *negative* effect dominates post-Mar 23: volume remains elevated

# Total change in daily dealer profits and revenues



# Supply vs. demand shock?



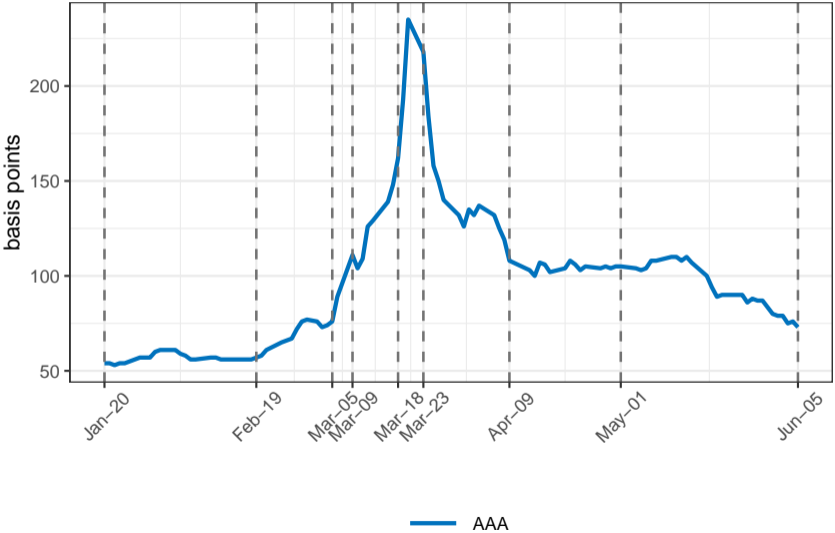
# Conclusion

- Dealers absorbed *no* additional inventory in late March: net *sellers*
- The cost to investors of trading immediately with a dealer surged
- Substitution to slower, less costly agency trades
- Fed intervention have relaxed balance sheet constraints
  - liquidity immediately improved for eligible bonds; and for a wide range of bonds after expansion
  - dealer bond inventories surged
- A simple model to estimate the impact of shocks on consumer surplus and dealer profits

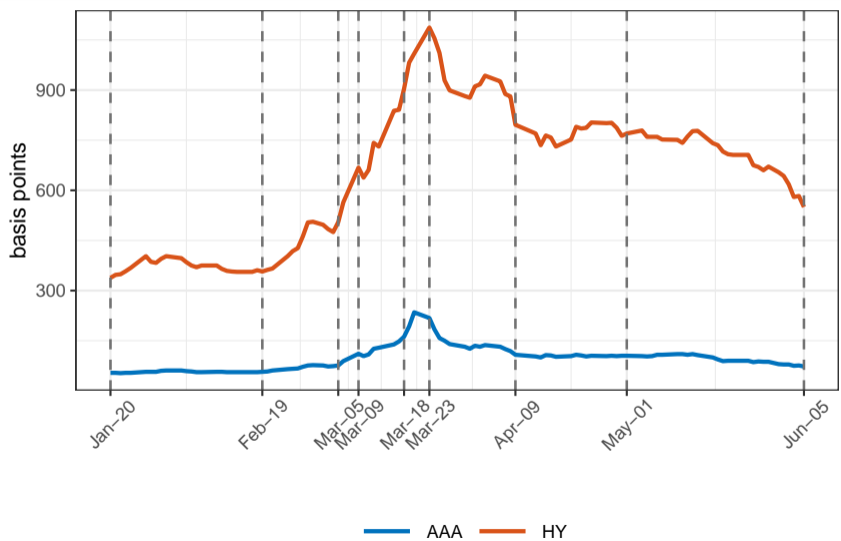
## Backup Slides

---

# Credit spread, AAA



# Credit spread, AAA and HY

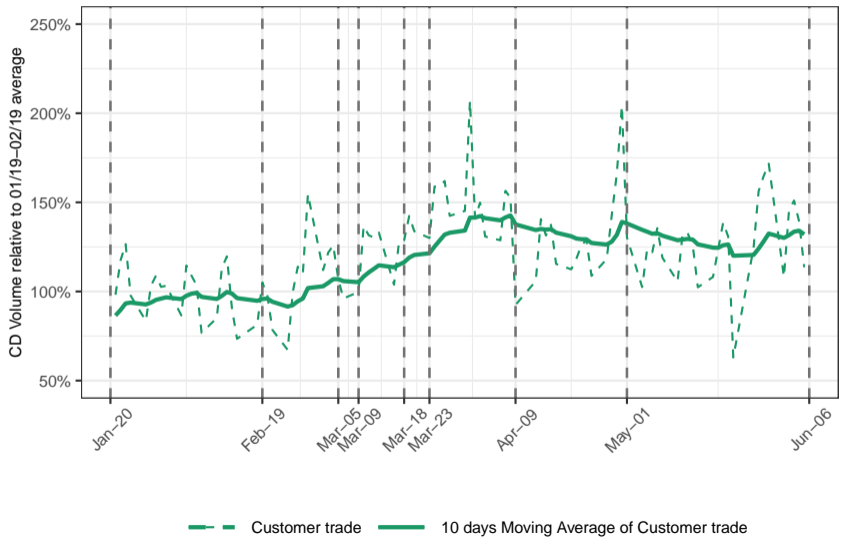


### “The Day Coronavirus Nearly Broke The Financial Markets”

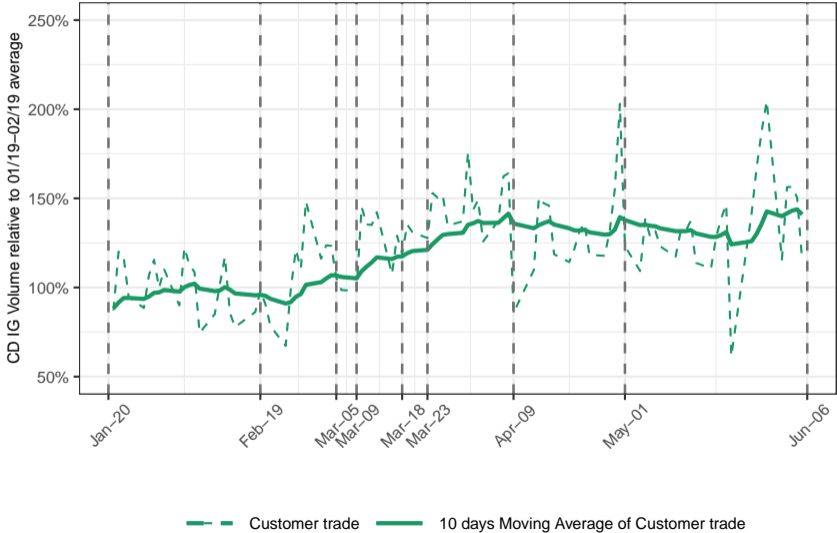
*“So when Mr. Rao called senior executives for an explanation on why [broker-dealers] wouldn’t trade, they had the same refrain: There was no room to buy bonds and other assets and still remain in compliance with tougher guidelines imposed by regulators after the previous financial crisis (. . .) One senior bank executive leveled with him: **“We can’t bid on anything that adds to the balance sheet right now.”**”*



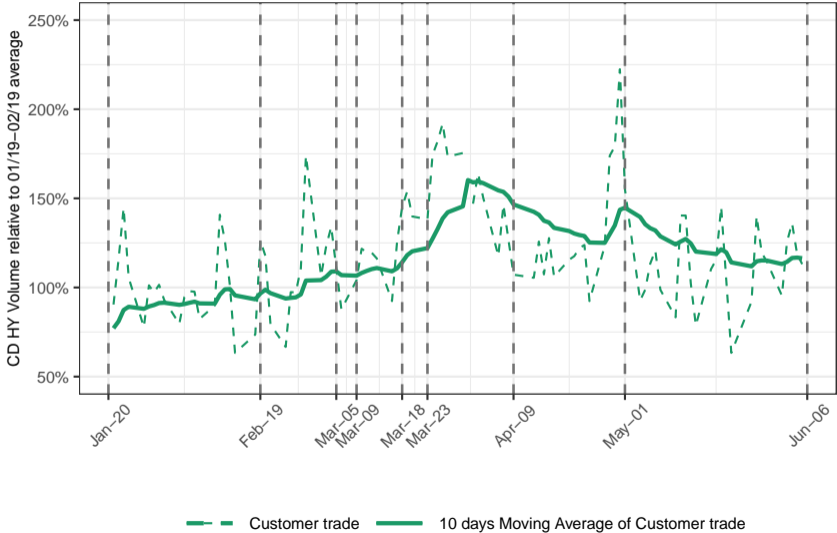
# Customer-to-dealer volume, all bonds



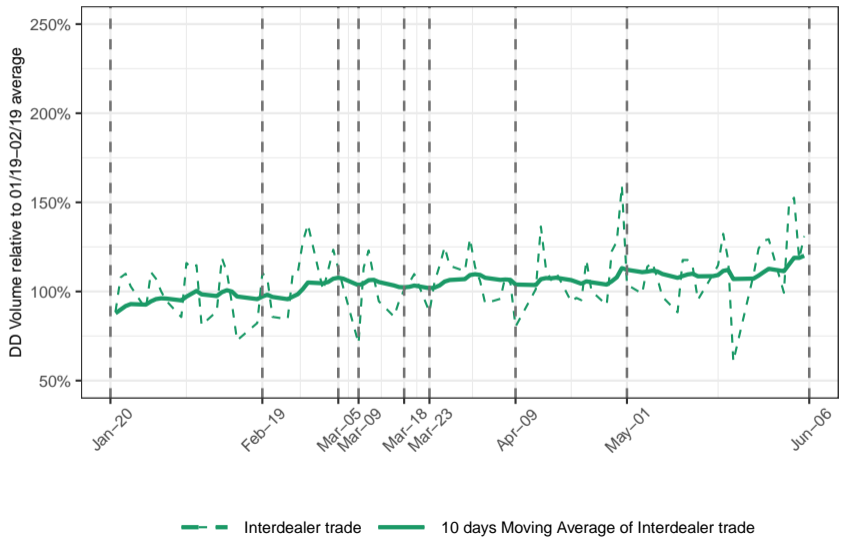
# Customer-to-dealer volume, IG bonds



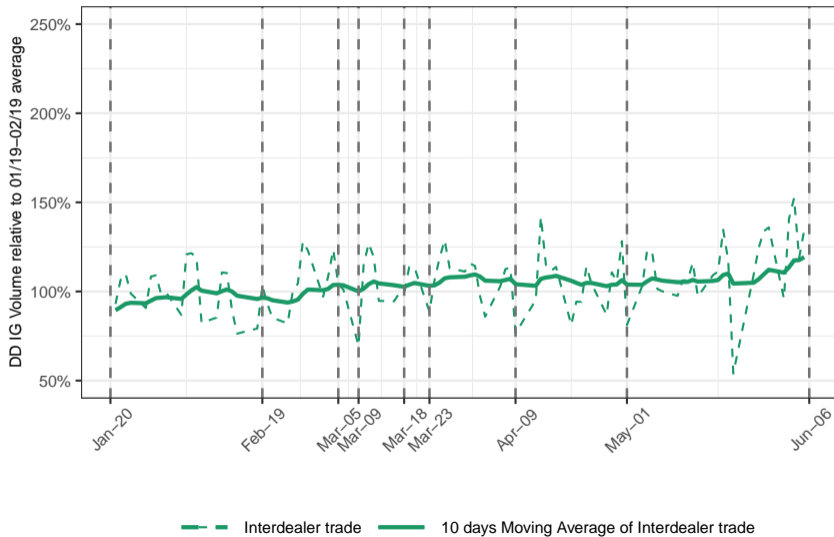
# Customer-to-dealer volume, HY bonds



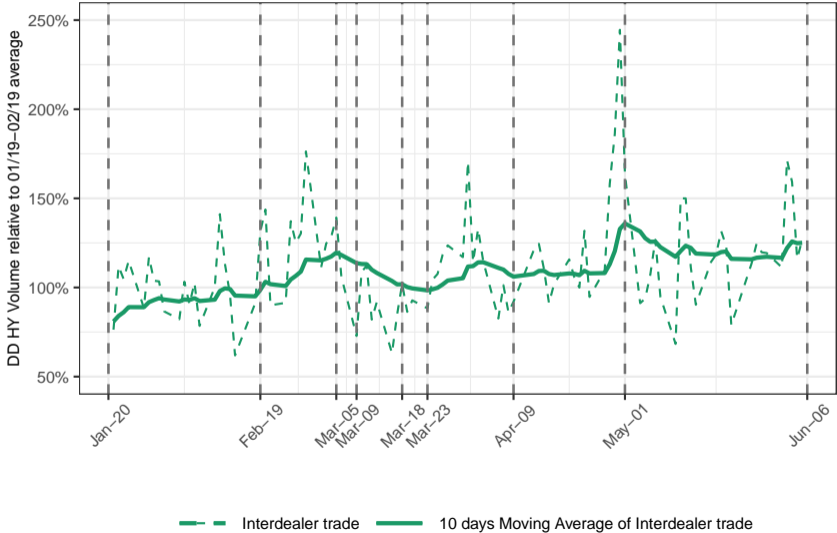
# Inter-dealer volume, all bonds



# Inter-dealer volume, IG bonds



# inter-dealer volume, HY bonds



# The natural conditions

- Customers' marginal value of high quality is larger:

$$u_h(x_l, x_h) - u_l(x_l, x_h) \geq 0$$

- Locally, the marginal cost of low-quality trades is increasing in  $N$ :

holding  $(x_l, x_h)$  fixed,  $C_l(Nx_l, Nx_h)$  increases in  $N$

$$\text{i.e., } \frac{\partial C_l(Nx_l, Nx_h)}{\partial N} \geq 0$$

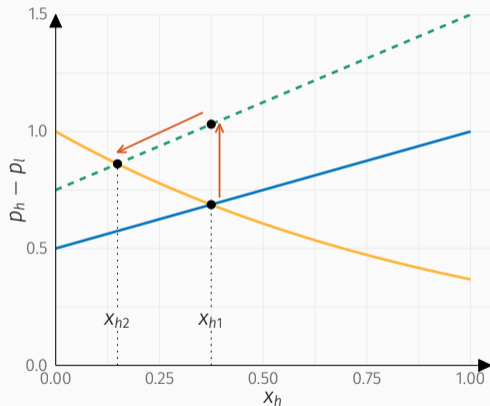
- Locally, the marginal cost of high-quality trades increases in  $N$  by more:

holding  $(x_l, x_h)$  fixed,  $C_h(Nx_l, Nx_h) - C_l(Nx_l, Nx_h)$  increases in  $N$

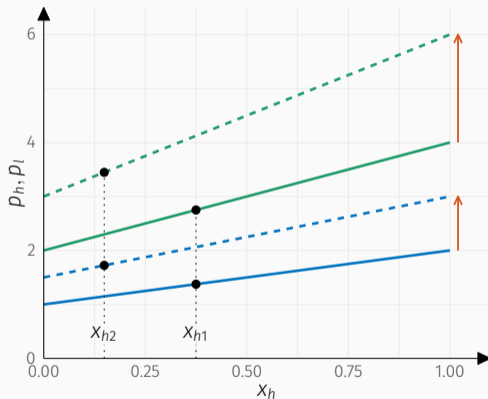
$$\text{i.e., } \frac{\partial C_h(Nx_l, Nx_h) - C_l(Nx_l, Nx_h)}{\partial N} \geq 0$$

# High- and low-quality: Equilibrium price and quantities

$$u_h(1 - x_h, x_h) - u_l(1 - x_h, x_h) = p_h - p_l = C_h(N(1 - x_h), Nx_h) - C_l(N(1 - x_h), Nx_h)$$



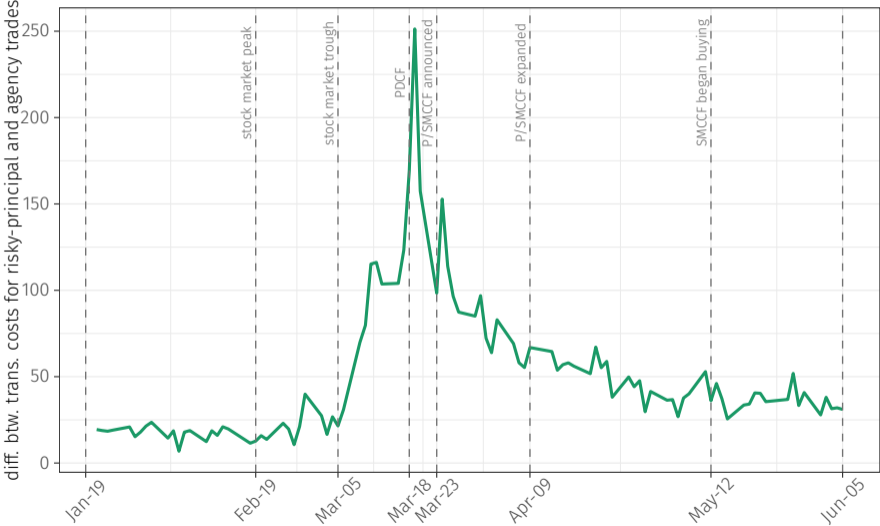
— Demand      - - - Supply, after shock  
— Supply, before shock



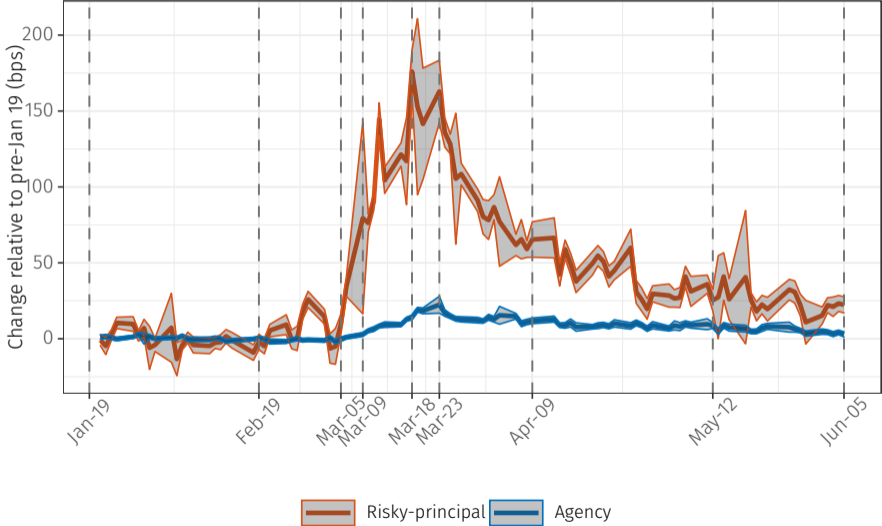
— MC low      - - - MC low, after shock  
— MC high      - - - MC high, after shock



# Trading costs for high- & low-quality (difference): Jan-Jun



# An entire set of time fixed effects



# Time-series evidence in regression

$$y_{ijt} = \alpha_i + \alpha_s + \beta_1 \times \text{Crisis}_t + \beta_2 \times \text{Intervention}_t + \varepsilon_{ijt}$$

- $y_{ijt}$ : transaction cost, or trade type dummy (agency or risky-principal)
- $\text{Crisis}_t$ : dummy for Mar 5–Mar 23
- $\text{Intervention}_t$ : dummy for after Mar 23
- $\alpha_i$  and  $\alpha_s$ : bond and size category FEs

# Trading cost: Jan 3–Jun 5

|                        | <i>Dependent variable:</i> |                      |                    |                    |
|------------------------|----------------------------|----------------------|--------------------|--------------------|
|                        | Risky-Principal            |                      | Agency             |                    |
|                        | All bonds<br>(1)           | US only<br>(2)       | All bonds<br>(3)   | US only<br>(4)     |
| Crisis                 | 106.57***<br>(14.17)       | 105.64***<br>(14.92) | 10.43***<br>(1.83) | 12.04***<br>(2.16) |
| Intervention           | 51.28***<br>(5.62)         | 52.07***<br>(5.93)   | 9.39***<br>(0.74)  | 10.16***<br>(1.03) |
| Bond FE                | Yes                        | Yes                  | Yes                | Yes                |
| Trade size category FE | Yes                        | Yes                  | Yes                | Yes                |
| Observations           | 769,809                    | 580,698              | 245,670            | 146,864            |
| Adjusted $R^2$         | 0.17                       | 0.18                 | 0.26               | 0.27               |

Note:

\* $p < 0.1$ ; \*\* $p < 0.05$ ; \*\*\* $p < 0.01$

# Substitution to agency trades

|                        | <i>Dependent variable:</i>                   |                     |                     |
|------------------------|--|---------------------|---------------------|
|                        | Probability of agency trade                  |                     |                     |
|                        | OLS  | Logit               | Probit              |
|                        | (1)  | (2)                 | (3)                 |
| Crisis                 | 0.038***<br>(0.010)                          | 0.037***<br>(0.010) | 0.037***<br>(0.009) |
| Intervention           | 0.031***<br>(0.004)                          | 0.030***<br>(0.004) | 0.030***<br>(0.004) |
| Bond FE                | Yes  | Yes                 | Yes                 |
| Trade size category FE | Yes  | Yes                 | Yes                 |
| Observations           | 7,052,589                                    | 7,052,589           | 7,052,589           |
| Adjusted $R^2$         | 0.113  |                     |                     |
| Pseudo $R^2$           |  | 0.085               | 0.085               |
| <i>Note:</i>           | * $p < 0.1$ ; ** $p < 0.05$ ; *** $p < 0.01$ |                     |                     |

# Spillover effects?

$$y_{ijt} = \alpha_i + \alpha_s + \beta_1 \times \text{Crisis}_t + \beta_2 \times \text{SMCCF}_t + \beta_3 \times \text{SMCCF Expansion}_t + \varepsilon_{ijt}$$

- $y_{ijt}$ : transaction cost, or trade type (agency or risky principal)
- $\alpha_i$  and  $\alpha_s$ : bond and size category FEs
- $\text{Crisis}_t$ : dummy for Mar 5–Mar 23
- $\text{SMCCF}_t$ : dummy for Mar 23–Apr 9
- $\text{SMCCF Expansion}_t$ : dummy for after Apr 9
- Eligible = IG  $\times$  (TTM  $\leq$  5 yr)

# Spillovers of Fed facilities to ineligible bonds

|                        | <i>Dependent variable:</i> |                      |                      |                    |                    |                    |
|------------------------|----------------------------|----------------------|----------------------|--------------------|--------------------|--------------------|
|                        | Risky-Principal            |                      |                      | Agency             |                    |                    |
|                        | All<br>(1)                 | Eligible<br>(2)      | Ineligible<br>(3)    | All<br>(4)         | Eligible<br>(5)    | Ineligible<br>(6)  |
| Crisis                 | 105.64***<br>(14.96)       | 111.67***<br>(15.62) | 102.16***<br>(15.65) | 11.92***<br>(2.16) | 16.32***<br>(3.52) | 9.64***<br>(1.80)  |
| SMCCF                  | 88.96***<br>(8.38)         | 62.14***<br>(8.68)   | 104.30***<br>(9.42)  | 14.35***<br>(1.15) | 11.78***<br>(1.26) | 15.98***<br>(1.49) |
| SMCCF Expansion        | 31.15***<br>(3.14)         | 15.35***<br>(3.08)   | 40.16***<br>(4.28)   | 7.20***<br>(1.01)  | 4.56***<br>(0.98)  | 9.08***<br>(1.44)  |
| Bond FE                | Yes                        | Yes                  | Yes                  | Yes                | Yes                | Yes                |
| Trade size category FE | Yes                        | Yes                  | Yes                  | Yes                | Yes                | Yes                |
| Observations           | 580,698                    | 200,761              | 379,937              | 146,864            | 50,192             | 96,672             |
| Adjusted $R^2$         | 0.18                       | 0.19                 | 0.18                 | 0.27               | 0.21               | 0.27               |

# DID: bonds just above/below TTM & rating threshold

|                         | <i>Dependent variable:</i> |                     |                     |                     |                 |                  |                 |                 |
|-------------------------|----------------------------|---------------------|---------------------|---------------------|-----------------|------------------|-----------------|-----------------|
|                         | Risky-principal            |                     |                     |                     | Agency          |                  |                 |                 |
|                         | (1)                        | (2)                 | (3)                 | (4)                 | (5)             | (6)              | (7)             | (8)             |
| SMCCF × Eligible        | -94.92**<br>(45.73)        | -86.46**<br>(43.93) | -73.52**<br>(30.56) | -73.52**<br>(30.56) | -2.82<br>(3.58) | -5.38<br>(3.80)  | -0.16<br>(3.90) | -0.16<br>(3.90) |
| SMCCF                   | 46.47<br>(29.20)           | 37.41<br>(24.24)    | 16.30<br>(17.65)    | 16.30<br>(17.65)    | 2.54<br>(1.89)  | 5.14**<br>(2.04) | 2.41<br>(2.34)  | 2.41<br>(2.34)  |
| Eligible                | 63.68<br>(46.38)           | 46.64<br>(52.37)    |                     |                     | -1.18<br>(4.19) | 7.74<br>(7.49)   |                 |                 |
| Bond controls           | Yes                        | Yes                 | No                  | No                  | Yes             | Yes              | No              | No              |
| Bond FE                 | No                         | No                  | Yes                 | Yes                 | No              | No               | Yes             | Yes             |
| Trade size FE           | Yes                        | Yes                 | Yes                 | Yes                 | Yes             | Yes              | Yes             | Yes             |
| Industry FE             | Yes                        | Yes                 | No                  | No                  | Yes             | Yes              | No              | No              |
| Credit rating FE        | No                         | Yes                 | No                  | Yes                 | No              | Yes              | No              | Yes             |
| Observations            | 14,124                     | 14,124              | 14,124              | 14,124              | 4,595           | 4,595            | 4,595           | 4,595           |
| Adjusted R <sup>2</sup> | 0.04                       | 0.05                | 0.16                | 0.16                | 0.12            | 0.13             | 0.28            | 0.28            |

Note:

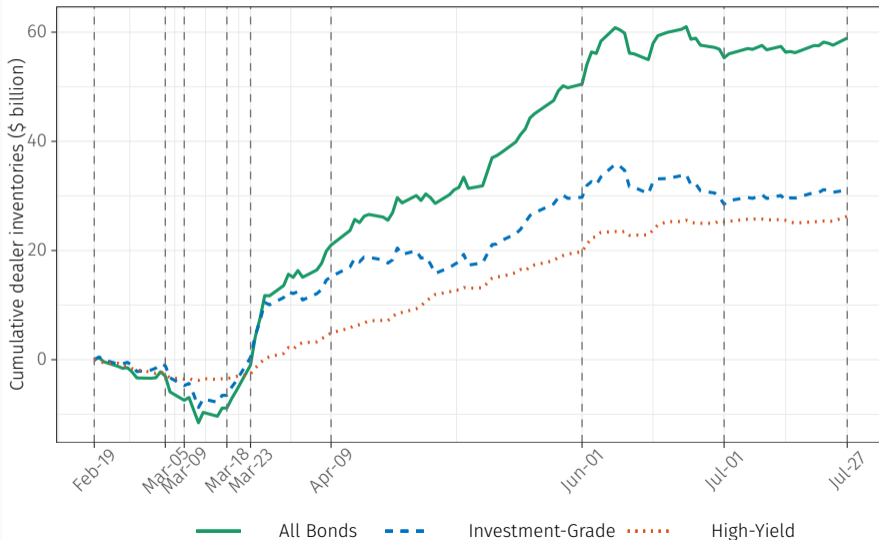
\*p<0.1; \*\*p<0.05; \*\*\*p<0.01



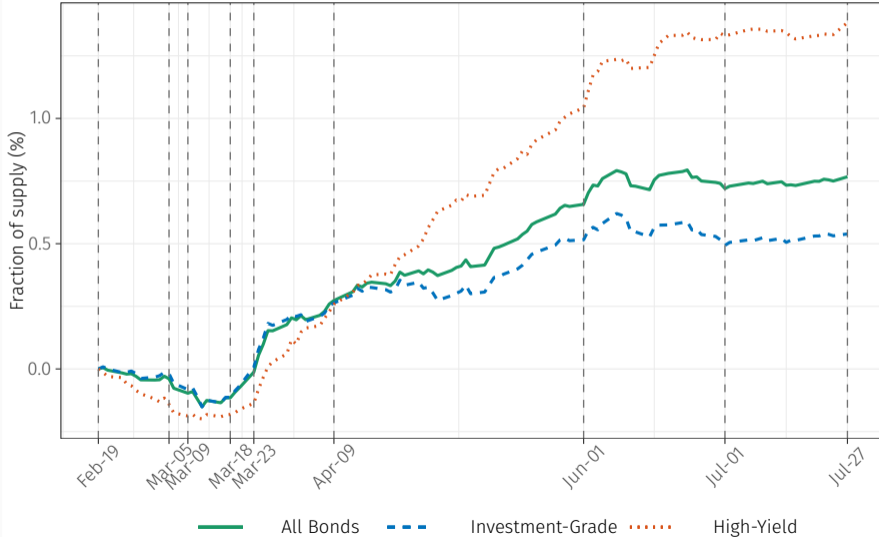
# Dealers inventory accumulation

- Complicated, since no info about dealers' initial position at issuance
- Moreover, in our data, trade size is top-coded
  - customer sell are larger than customer buy
  - underestimate total customer sell by more than customer buy
- We use Daily Market Sentiment data (FINRA)
  - report aggregate customer sell and customer buy (not top-coded)
- We calculate difference btw. customer sell and buy
  - we show cumulative series

# Cumulative dealer inventories across ratings (more recent)



# Cumulative dealer inventories across ratings (as % of supply)



# Supply vs. demand shock?

- So far, dealer cost function,  $C(X)$  assumed to be constant.
- Surge in volume & price inconsistent with supply shock *only*
- Suppose instead,  $C(X_l, X_h) = \Psi(X_l, \gamma X_h)$ ;  $\gamma > 0$  is a cost-shifter for high-quality trades
- MRS btw. agency and risky-principal trades

$$\frac{C_h}{C_l} = \frac{p_h}{p_l} = \gamma \frac{\Psi_h}{\Psi_l}.$$

- MRS increased dramatically in mid-March. Two possibilities:
  - holding  $\gamma$  fixed: demand  $N$  could've increased
  - holding demand fixed:  $\gamma$  could've increased

# MRS between agency and risky-principal trades

