

# A Model of Supply Chain Finance

Bo Hu<sup>1</sup>   Makoto Watanabe<sup>2</sup>   Jun Zhang<sup>3</sup>

<sup>1, 3</sup> Fudan University, Shanghai

<sup>2</sup>KIER, Kyoto University

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# What is Supply Chain Finance (SCF)?

Consider a large buyer firm, e.g., Walmart, Siemens, etc.

- ▶ a large number of heterogeneous suppliers
- ▶ suppliers face shortage of working capital from time to time

Supply chain finance:

- ▶ a program offered by the buyer firm (possibly with financiers)
- ▶ select among its suppliers to join
- ▶ suppliers are given extended payment terms
- ▶ suppliers can request immediate payment at a small discount

## The Co-op Partners with PrimeRevenue to Protect Suppliers Amid Economic Volatility



*UK's sixth largest food retailer makes strategic transition to PrimeRevenue platform*

**Atlanta, GA – Manchester, UK, August 11, 2020** – PrimeRevenue, the leading platform for working capital finance solutions, and The Co-operative Group, today announce a new supply chain finance partnership. Barclays Bank PLC, who introduced The Co-op to PrimeRevenue, will be providing funding on the supply chain finance programme followed by other financial institutions as the programme grows.

Co-op has made the strategic decision to partner with PrimeRevenue for its new supply chain finance offering. Fueled by a highly challenging business climate heightened by the pandemic, the company aims to offer suppliers a simple method of early payment to help with their cash flow without having a detrimental impact to Co-op's own cash position. This is particularly relevant in the current environment where the old adage "cash is king" has never been truer.

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## Why do we care?

SCF is happening and on the rise

- ▶ SCF has been widely adopted by large corporations
- ▶ The size of the SCF market is \$1.8 trillion globally in 2021

SCF can be a “SLEEPING RISK” that “MASKS EPISODES OF FINANCIAL STRESS.” (S&P Global Inc.)

- ▶ The buyer firm (and associated supply chain) may face difficulties if financing cost increases
- ▶ FASB: Starting in 2023, corporations will have to disclose the terms and size of the SCF programs in the financial statement.

## Preview of the model

- ▶ A simple model of a middleman funding suppliers.
- ▶ Heterogeneous suppliers: **productivity** and **liquidity needs**.
- ▶ The middleman selects suppliers into the SCF program
- ▶ We then integrate this model into a standard monetary framework (Lagos and Wright, 2005).

# Preview of key results

## Liquidity cross-subsidization

- ▶ use liquidity from suppliers with **negative** profits
- ▶ to fund suppliers with **positive** profits
- ▶ links to the cost of market liquidity

## Friedman rule can be suboptimal

- ▶ market liquidity is more costly  $\Rightarrow$  SCF relies more on suppliers' liquidity
- ▶ more suppliers included  $\Rightarrow$  more trade created (under some conditions)

## Related literature

- ▶ Multi-product intermediaries:
  - ▶ Rhodes et al. (2021), Spulber (1996).
  - ▶ Liquidity issues are not addressed
- ▶ Banking and Money
  - ▶ Berentsen et al. (2007), Gu et al. (2013), Andolfatto et al. (2019)
  - ▶ Our model emphasizes the ex-ante selection of depositors
  - ▶ Unlike in Diamond and Dybvig (1983), the late-type depositors in our model do not have the incentive to run
- ▶ Supply chain finance:
  - ▶ In econ and finance, closely related is trade credit.
  - ▶ In management science, e.g., Kouvelis and Xu (2021)
  - ▶ Our model: one big buyer firm with many suppliers.



# This talk

1. Benchmark model
  - ▶ an endowment economy (one-period model)
  - ▶ a subperiod (DM) in Lagos and Wright (2015) framework
2. Endogenous liquidity holdings
3. Welfare analysis
4. Extension

# This talk

## 1. Benchmark model

- ▶ an endowment economy (one-period model)
- ▶ a subperiod (DM) in Lagos and Wright (2015) framework

## 2. Endogenous liquidity holdings

## 3. Welfare analysis

## 4. Extension

# 1. The Benchmark Model

# Agents

- ▶ A mass of suppliers:
  - ▶ each produces a unique and indivisible good
  - ▶ constant marginal costs,  $c \in [\underline{c}, \bar{c}]$ , differ among suppliers
  - ▶  $c$  is publicly observable
- ▶ A mass of consumers:
  - ▶ unit demand for each good with *common* utility  $u > \bar{c}$
- ▶ One middleman:
  - ▶ purchases from suppliers and resells to consumers
  - ▶ operates an SCF program (specified later)
  - ▶ fixed cost  $k > 0$  to handle each supplier

## Endowments/Liquidity

- ▶ There is a *numeraire* good (money)
- ▶ Consumers have enough endowment of numeraire
- ▶ The middleman has endowment (measure)  $L \geq 0$
- ▶ Suppliers have **no** endowment, however, production cost  $c$  must be paid using the numeraire good.

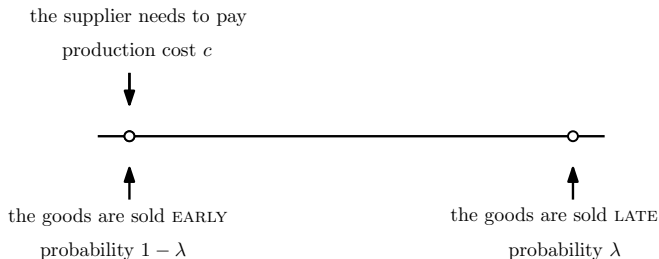
## Retail market

- ▶ Without the middleman, suppliers can trade directly with consumers.
- ▶ Suppliers can meet ALL consumers, trade bilaterally:
  - ▶ if a trade occurs, the retail-trade surplus is split equally:

$$p - c = (u - c)/2$$

- ▶ however, trade may not occur due to liquidity frictions.

# Liquidity shocks



- ▶ A liquidity shock is realized at the beginning of period
- ▶ With prob  $1 - \lambda$ , a supplier encounters no liquidity issue,  $c$  can be covered by using retail revenue
- ▶ With prob  $\lambda$ , a supplier encounters a liquidity issue, the supplier cannot produce since he has no numeraire

## Ex ante heterogeneity of suppliers

- ▶ Each supplier is indexed by

$$(\lambda, c) \in \Omega = [0, 1] \times [\underline{c}, \bar{c}],$$

where  $\lambda$  is prob liquidity shock,  $c$  is the const marginal cost

- ▶  $(\lambda, c)$  is publicly observable, following a distribution C.D.F.  $G$ , P.D.F.  $g > 0$  on  $\Omega$
- ▶ The realization of the liquidity shock can be public or private information.



## Middleman and SCF program

- ▶ Middleman observes  $(\lambda, c)$ , and selects suppliers into SCF program.
- ▶ Selection policy:

$$q(\lambda, c) = \begin{cases} 1 & \text{if } (\lambda, c) \text{ is selected,} \\ 0 & \text{otherwise.} \end{cases}$$

## Middleman and SCF program (cont.)

Given a supplier is invited  $q(\lambda, c) = 1$ , the middleman gives a TIOLI offer based on  $(\lambda, c)$ :

- ▶ The middleman sells the goods on behalf of the supplier
  - ▶ bilateral trade / suppliers quite the market.
- ▶ The middleman transfers a revenue  $f(\lambda, c)$  at end of period.
- ▶ The middleman pays  $c$  to the supplier at beginning of period.

An SCF program can be represented by:

$$\{q(\lambda, c), f(\lambda, c)\}_{(\lambda, c) \in \Omega} \in \{0, 1\} \times \mathbb{R}_+.$$

# SCF program (alternative setting)

Intermediary, instead of a middleman

Given  $q(\lambda, c) = 1$ , SCF gives a TIOLI offer based on  $(\lambda, c)$ :

- ▶ Supplier gives his retail revenue  $p$  to the intermediary
- ▶ The intermediary transfers to the supplier a reward at end of period
  - ▶  $f^E(\lambda, c)$  if revenue transferred at beginning of period
  - ▶  $f^L(\lambda, c)$  if revenue transferred at end of period
- ▶ The intermediary always pays  $c$  to supplier at beginning of period

An SCF program can be represented by:

$$\{q(\lambda, c), f^E(\lambda, c), f^L(\lambda, c)\}_{(\lambda, c) \in \Omega} \in \{0, 1\} \times \mathbb{R}_+.$$

# Timing

1. Middleman announces SCF, and invites suppliers.  
Suppliers decide to accept or not.
2. Liquidity shock of each supplier is realized, suppliers produce.  
Middleman pays  $c$  to participating suppliers, meanwhile, trade occurs in the retail market.
3. The middleman pays each supplier  $f(\lambda, c)$ .

# Analysis

## Solution concept

- ▶ Complete information game
- ▶ Subgame perfection

## Suppliers' participation decision

- ▶ Supplier  $(\lambda, c)$  joins SCF program if

$$\underbrace{f(\lambda, c)}_{\text{join SCF}} \geq \underbrace{(1 - \lambda)(u - c)/2}_{\text{not join SCF}}$$
$$\Rightarrow f(\lambda, c) = (1 - \lambda)(u - c)/2$$

## Profits and liquidity contributions to SCF

- ▶ A supplier contributes to SCF in PROFIT and LIQUIDITY.

- ▶ Profit contribution:

$$\pi(\lambda, c) = p - c - f - k = \lambda(u - c)/2 - k.$$

- ▶ Liquidity contribution at the time of production:

$$\theta(\lambda, c) = (1 - \lambda)p - c = (1 - \lambda)(u + c)/2 - c.$$

- ▶  $\pi$  and  $\theta$  can be positive or negative depending on  $(\lambda, c)$

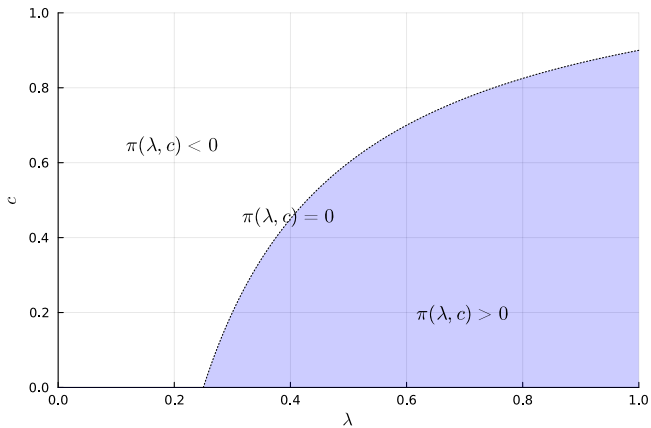


Figure: profit contributions in  $(\lambda, c)$  space

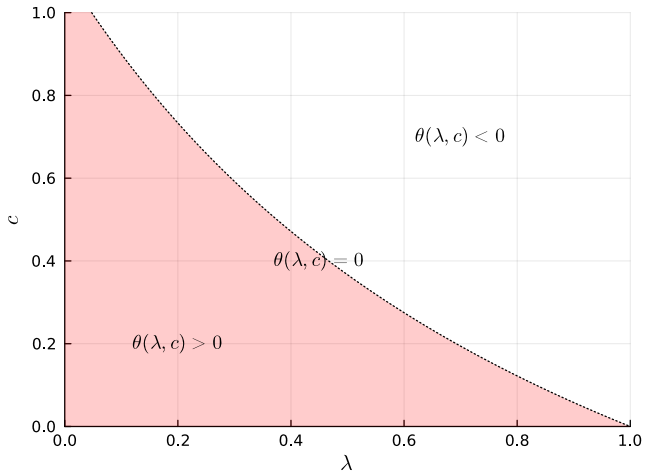


Figure: liquidity contributions in  $(\lambda, c)$  space



- The middleman's profit maximization problem:

$$\max_{q(\lambda, c) \in \{0, 1\}} \int_{\Omega} q(\lambda, c) \pi(\lambda, c) dG$$

subject to the liquidity constraint:

$$\underbrace{\int_{\Omega} q(\lambda, c) \theta(\lambda, c) dG}_{\text{total liquidity}} + L \geq 0,$$

where initial liquidity holdings  $L \geq 0$  (exogenous for now).

## Profit-maximizing selection policy

- ▶ The middleman's problem can be solved using the Lagrangian:

$$\mathcal{L} = \int_{\Omega} q(\lambda, c) \left[ \pi(\lambda, c) + \mu \theta(\lambda, c) \right] dG(\lambda, c).$$

- ▶  $\mu \geq 0$ : Lagrangian multiplier of the liquidity constraint; the shadow value of liquidity.
- ▶ The optimal selection policy:

$$q(\lambda, c, \mu) = \begin{cases} 1 & \text{if } \pi(\lambda, c) + \mu \theta(\lambda, c) \geq 0 \\ 0 & \text{if otherwise.} \end{cases}$$

## Proposition (Liquidity cross-subsidization)

*The middleman optimally selects suppliers from*

- ▶ *Region A: positive profit and positive liquidity contributions*

$$\pi(\lambda, c) \geq 0, \quad \theta(\lambda, c) \geq 0$$

- ▶ *Region B: positive profit and negative liquidity*

$$\pi(\lambda, c) > 0, \quad \theta(\lambda, c) < 0, \quad \underbrace{\pi/(-\theta)}_{\text{returns}} \geq \mu$$

- ▶ *Region C: negative profit and positive liquidity*

$$\pi(\lambda, c) < 0, \quad \theta(\lambda, c) > 0, \quad \underbrace{-\pi/\theta}_{\text{costs}} \leq \mu$$

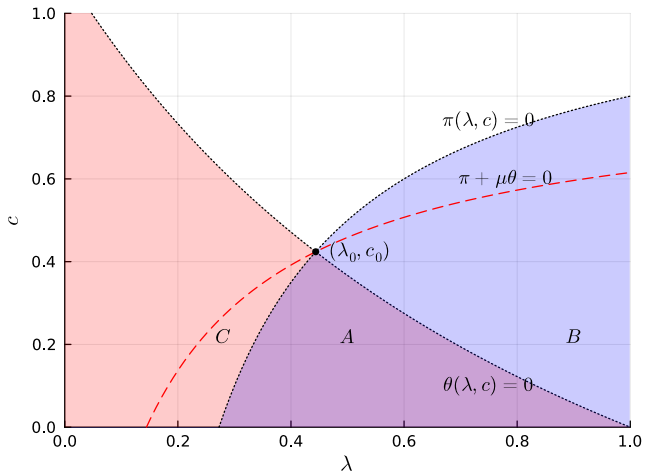


Figure: Liquidity cross-subsidization

## Determine $\mu$

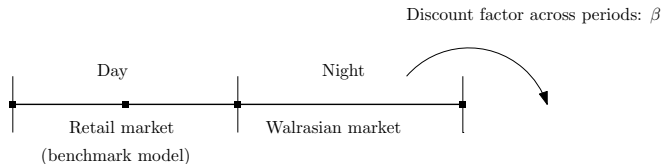
The liquidity constraint determines  $\mu = \mu(L)$ :

$$\int_{\Omega} q(\lambda, c, \mu)\theta(\lambda, c)dG + L = 0.$$

- ▶  $\mu(L) = 0$ : liquidity does not matter for selecting suppliers; selection is solely based on  $\pi(\lambda, c)$
- ▶  $\mu(L) > 0$ : liquidity cross-subsidization, strictly decreases in  $L$
- ▶  $\mu(0)$ : the liquidity value at  $L = 0$ , or shadow price of the first marginal unit of liquidity

## 2. Endogenous liquidity holdings

# Standard monetary approach (Lagos and Wright, 2005)



- ▶ Day market (the benchmark model)
  - ▶ the numeraire good is a medium of exchange, e.g., fiat money
  - ▶ suppliers must pay for production costs using fiat money
- ▶ Night market (Walrasian)
  - ▶ all other markets, where the middleman and consumers can “earn” fiat money by producing a “general good”
  - ▶ 1 unit of fiat money worth  $\phi_t$  units of general good:  $L_t = \phi_t l_t$ .

## Liquidity holdings of the middleman

- ▶ The middleman chooses  $l(\equiv L/\phi)$  units fiat money

$$\max_{l \geq 0} \left\{ -\phi_{t-1}l + \beta V_t(l) \right\} \Rightarrow \phi_{t-1} \geq \beta V_t'(l).$$

- ▶ middleman's value of carrying  $l$  units of fiat money:

$$V_t(l) = \left\{ \phi_t l + \max_{q(\lambda, c)} \int_{\Omega} q(\lambda, c) \pi(\lambda, c) dG, \quad \text{s.t. } \Theta + \phi_t l \geq 0. \right\}$$
$$\Rightarrow V_t'(l) = \phi_t (1 + \mu(L))$$

- ▶ Euler equation:  $\phi_{t+1} \geq \beta \phi_t (1 + \mu(L))$ , or equivalently

$$i \geq \mu(L).$$



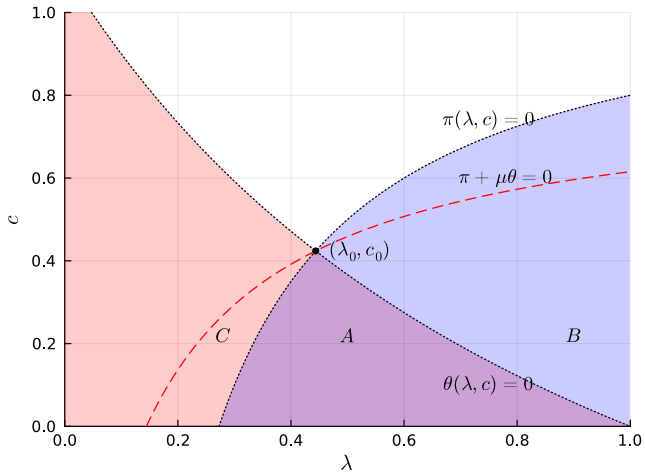
## Proposition

For  $i \leq \bar{i}$ , there exists a unique monetary equilibrium with SCF program described by  $q(\lambda, c, \mu)$ ,  $f(\lambda, c)$ , shadow value of liquidity:

$$\mu = \min\{\mu(0), i\},$$

and middleman's liquidity holding:

$$\begin{cases} \mu(L^*) = i & \text{if } i < \mu(0); \\ L^* = 0 & \text{if } i \geq \mu(0). \end{cases}$$



In equilibrium,  $\mu = \min\{\mu(0), i\}$ .

### 3. Welfare and Inflation

## Planner's problem

- ▶ Trade surplus:

$$v(\lambda, c) = \lambda(u - c) - k.$$

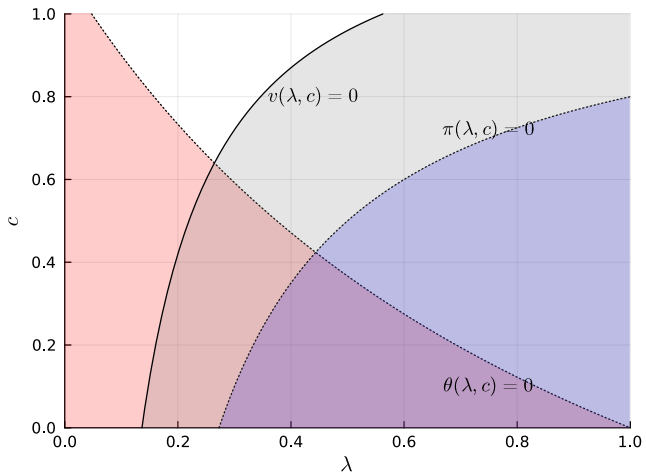
Rather than profits  $\pi(\lambda, c) = \lambda(u - c)/2 - k$ .

- ▶ Planner's problem:

$$\max_{I(\lambda, c)} \int_{\Omega} I(\lambda, c) v(\lambda, c) dG.$$

- ▶ The efficient allocation:

$$I(\lambda, c) = 1 \text{ if } v(\lambda, c) \geq 0$$

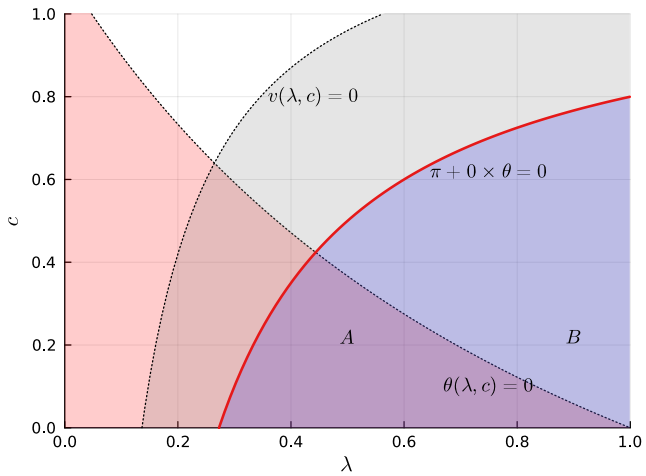


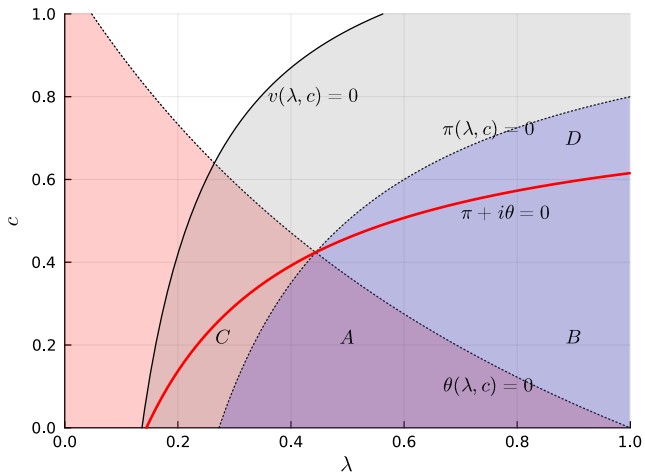
## SCF is welfare improving

- ▶ At any given  $i \leq \bar{i}$ , SCF leads to an increase in welfare:

$$\begin{aligned}\Delta\mathcal{W}(i) &= \int_{\Omega} q(\lambda, c, \mu(i))v(\lambda, c)dG \\ &\geq \int_{\Omega} q(\lambda, c, \mu(i))\pi(\lambda, c)dG > 0.\end{aligned}$$

- ▶  $\Delta\mathcal{W}(i)$  may increase in  $i$ :
  - ▶  $k > 0$ ; not all suppliers are in SCF under  $i = 0$
  - ▶ higher  $i$  induces more cross-subsidization and more trade







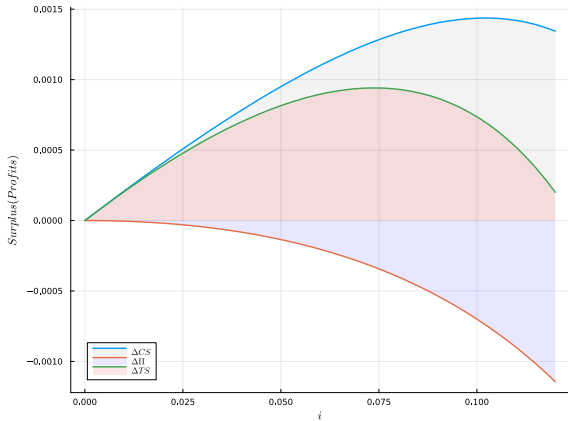


Figure: Welfare is non-monotonic in  $i$  under uniform distribution of  $(\lambda, c)$

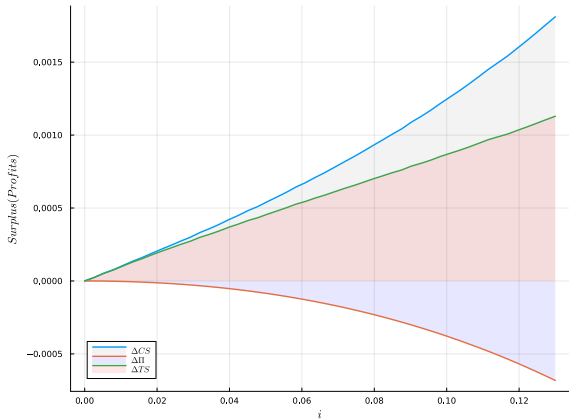


Figure: Welfare increases in  $i$  under Beta distributions of  $\lambda$  and  $c$

4. Extension: If suppliers access to market liquidity?

## Suppliers' money holding

- ▶ A supplier needs to hold  $\hat{m} = \frac{c}{\phi_{+1}}$  in the previous night market:

$$\text{cost : } \phi \hat{m} \text{ v.s. benefit : } \beta^s \left[ \phi_{+1} \hat{m} + \lambda(p - c) \right].$$

- ▶ Suppliers purchase money in previous night market if

$$c < c^s(\lambda, i) \equiv \frac{\lambda}{i^s + \lambda} p.$$

- ▶ The *updated* selection rule:

$$q(\lambda, c, \mu) = 1 \text{ if } \pi(\lambda, c) + \mu\theta(\lambda, c) \geq 0 \text{ and } c \geq c^s(\lambda, i).$$

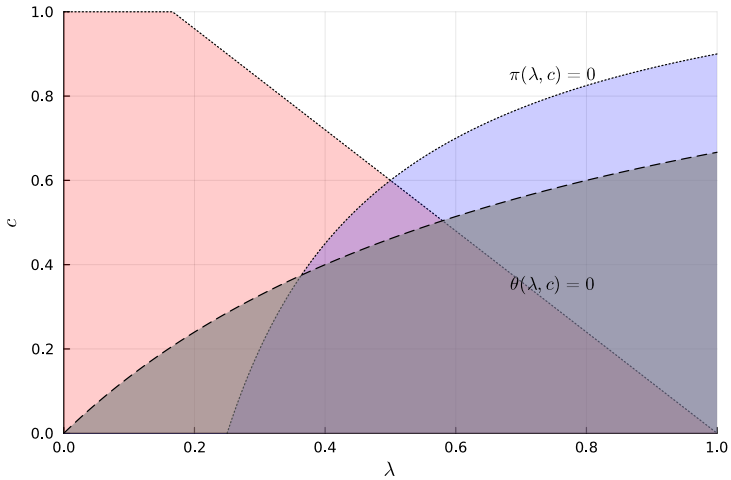


Figure: Suppliers access to liquidity (high  $i$ )

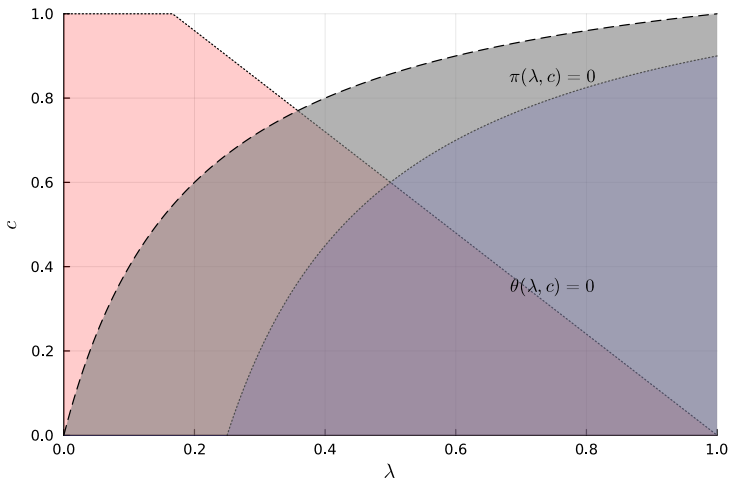
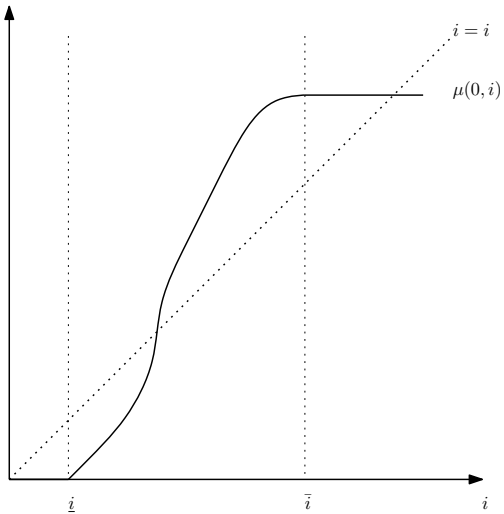


Figure: Suppliers access to liquidity (low  $i$ )

$i, \mu(0, i)$



# Takeaways

- ▶ SCF: a middleman pools liquidity from (early) suppliers, and funds suppliers for liquidity needs
- ▶ SCF features LIQUIDITY CROSS-SUBSIDIZATION
- ▶ SCF helps mitigate the high cost of market liquidity
- ▶ Deviating from Friedman rule can be welfare-enhancing