

# SUPPLY NETWORK FORMATION AND FRAGILITY

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Cambridge

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Northwestern

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May 2022

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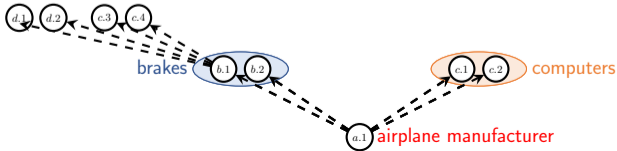
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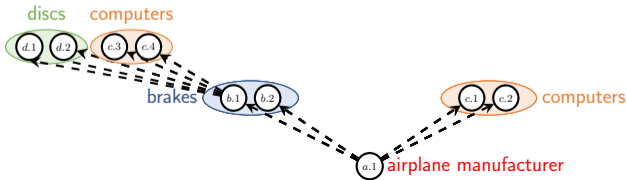
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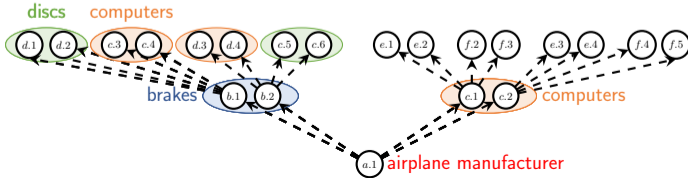
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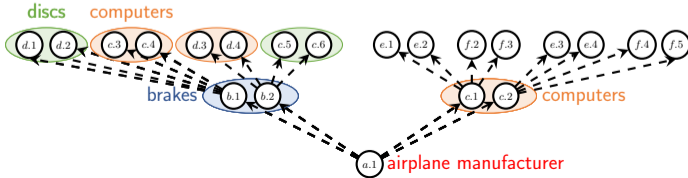
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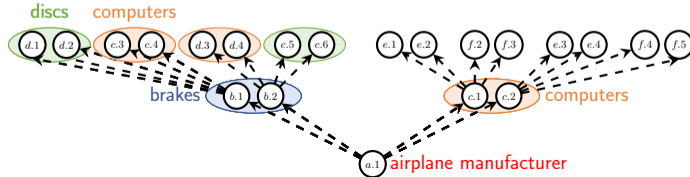
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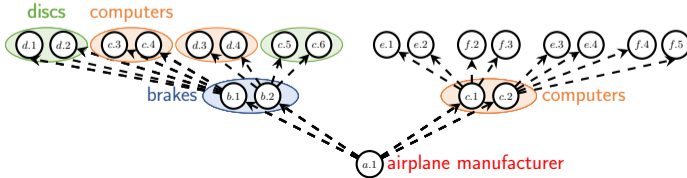
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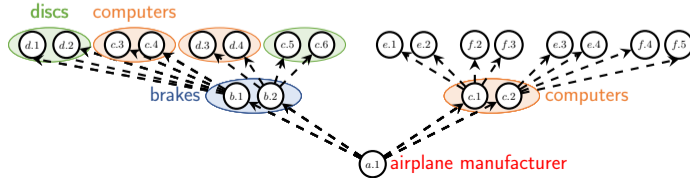
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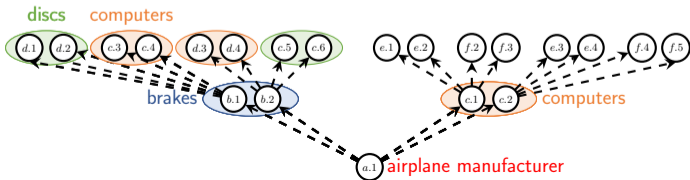
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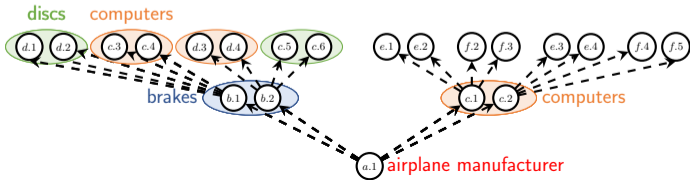
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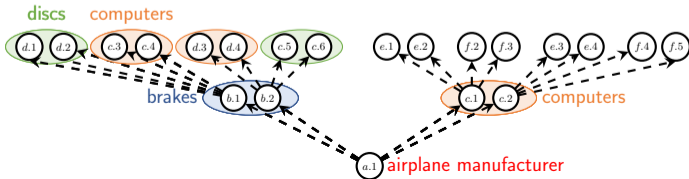
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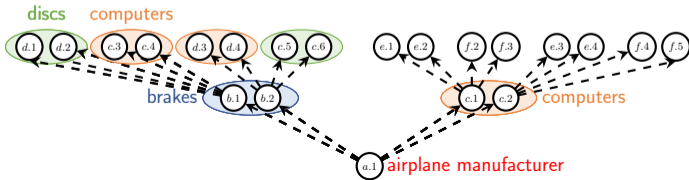
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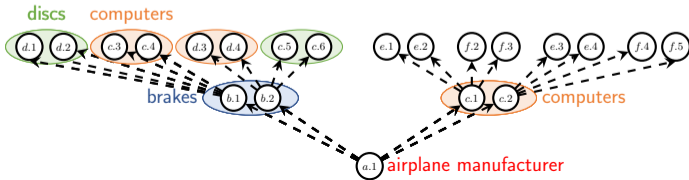
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- Inefficient.

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Global shortages of many goods reflect the disruption of the pandemic combined with decades of companies limiting their inventories.

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- *Simply expanding warehouses may not provide the fix... Product lines are increasingly customized. The ability to predict what inventory you should keep is harder and harder.*



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Model agents (firms) endogenously investing in their links. Interesting mechanics and welfare issues.

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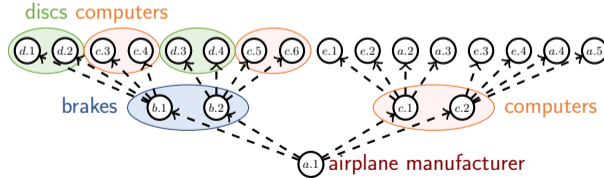
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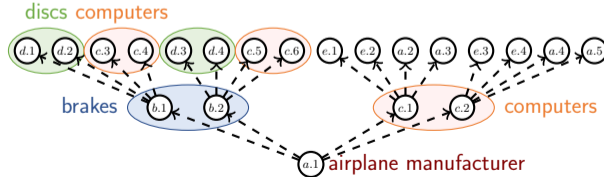


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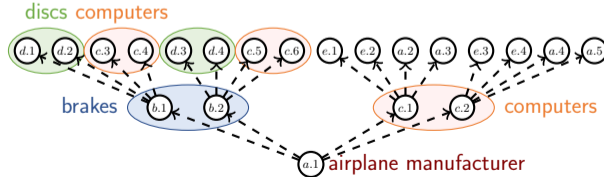


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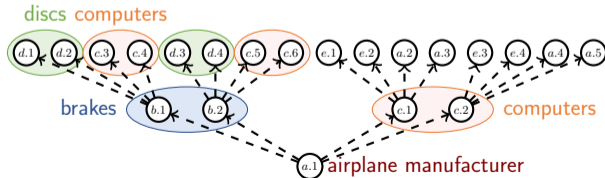
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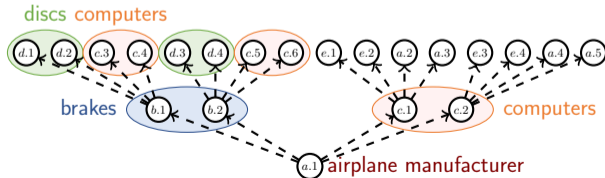
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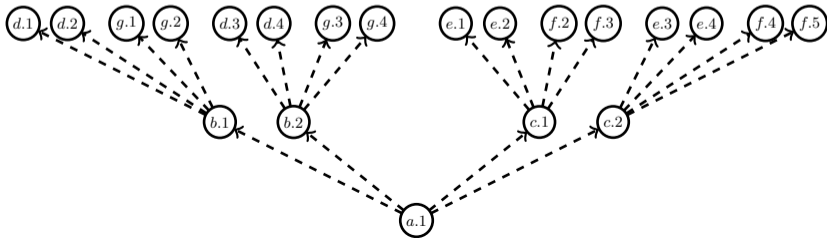
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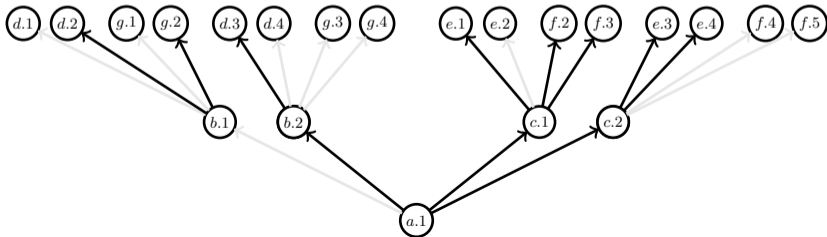
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$\tilde{\rho}(x, d)$  – probability that firm  $a.1$  can produce; “reliability”



# The supply network upstream of one firm

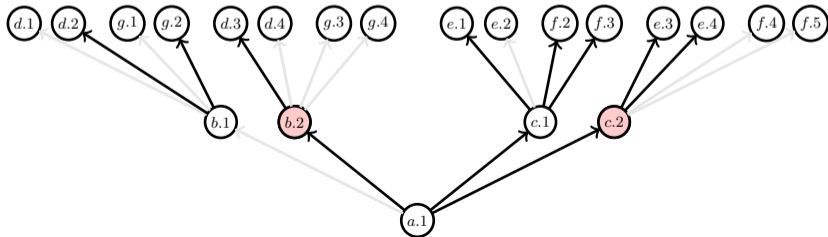
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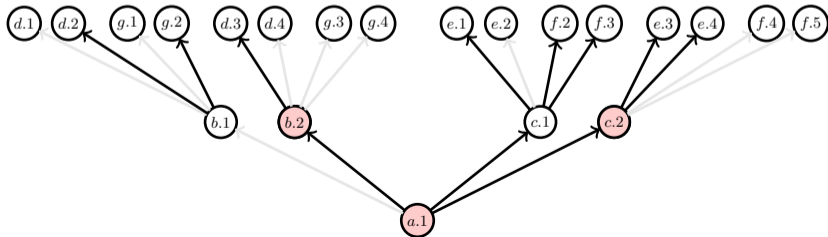
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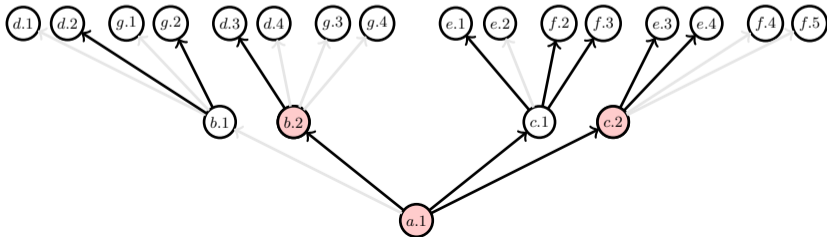
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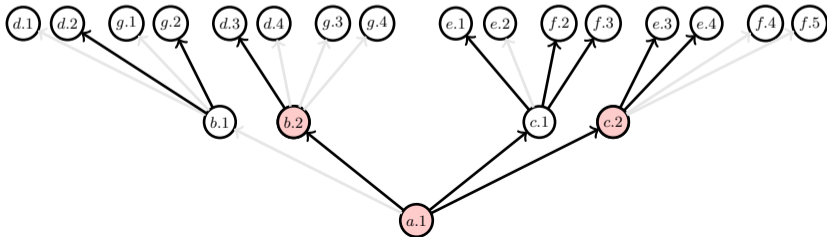
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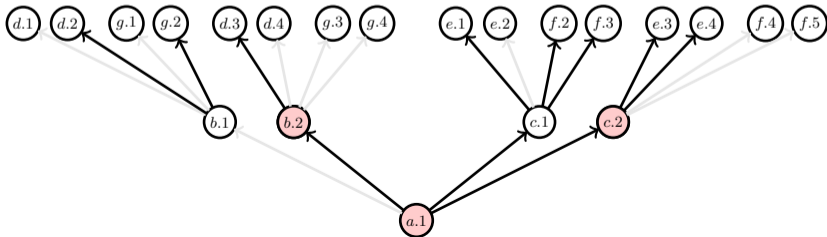
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## Model basics

## Example

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## Potential supply network $\mathcal{G}'$

A graph on the set of all firms:      nodes  $\mathcal{F}$   
 directed links  $\mathcal{E}'$













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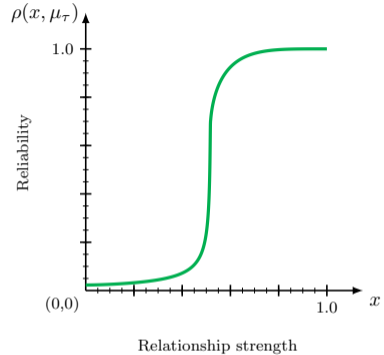
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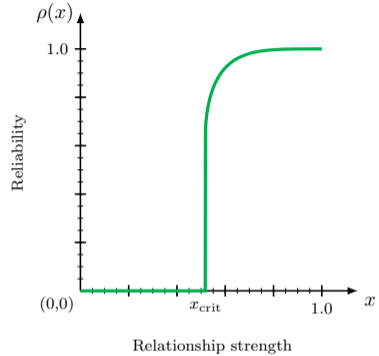
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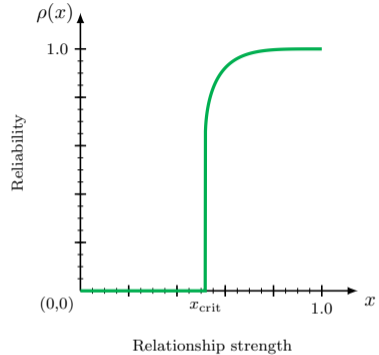
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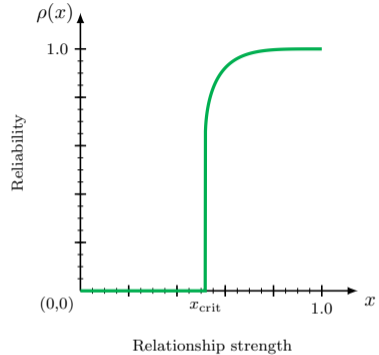
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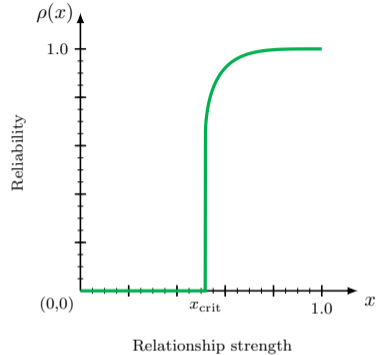
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There are positive numbers  $x_{crit}$ ,  $r_{crit}$  s.t.

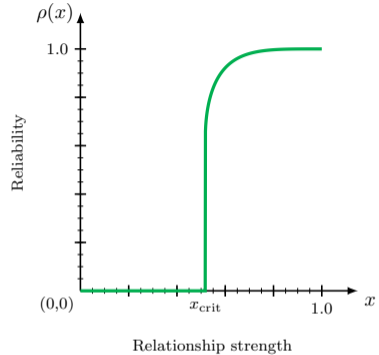
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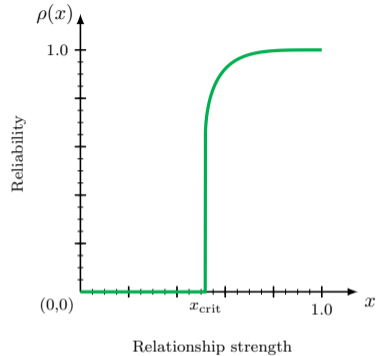
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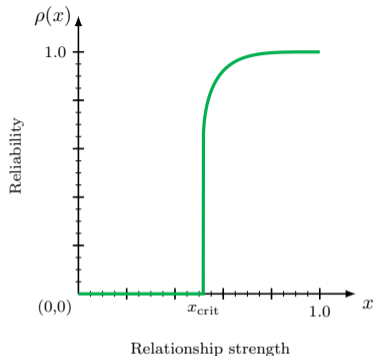
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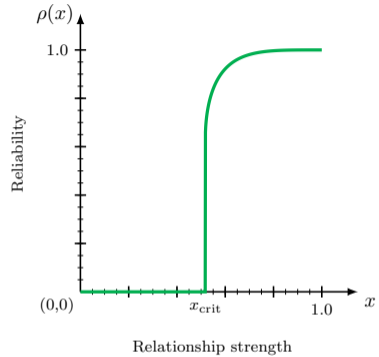
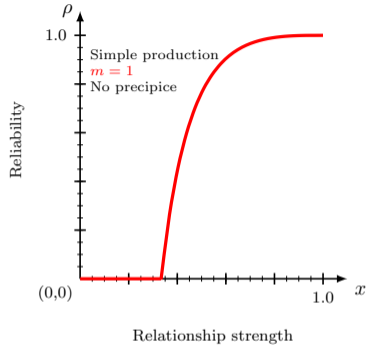
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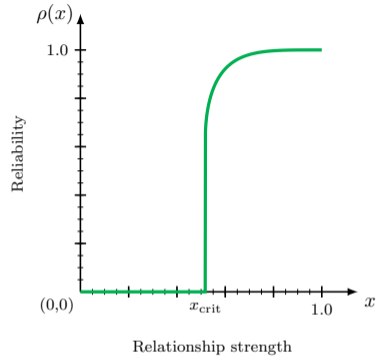
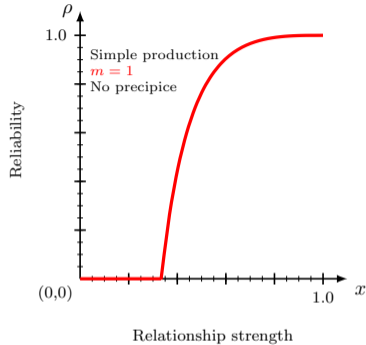
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This does not happen for simple production,  $m = 1$ .

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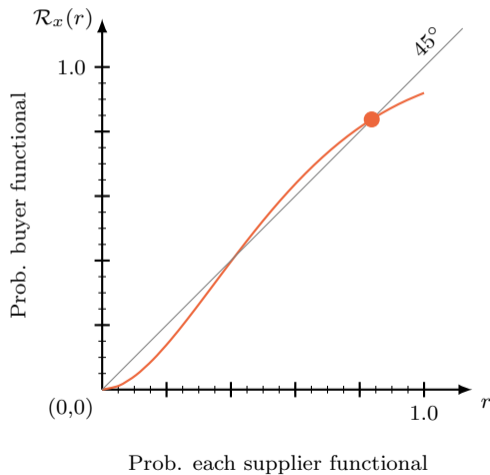
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## Part 1: How reliability depends on supplier reliability

- Suppose each of your suppliers is functional with probability  $r$  independently.

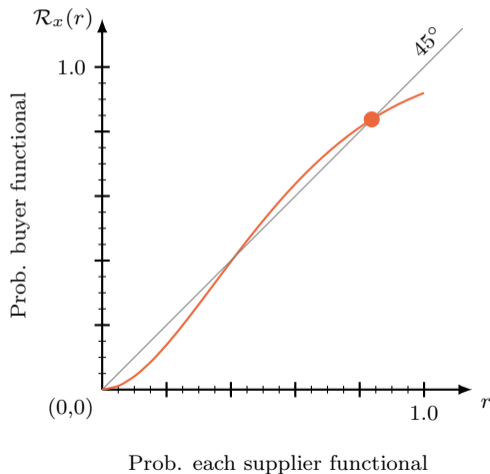


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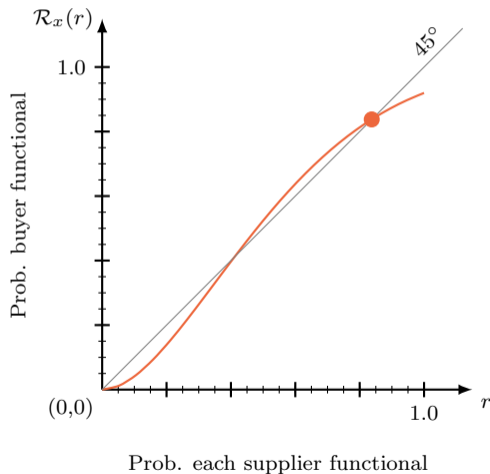
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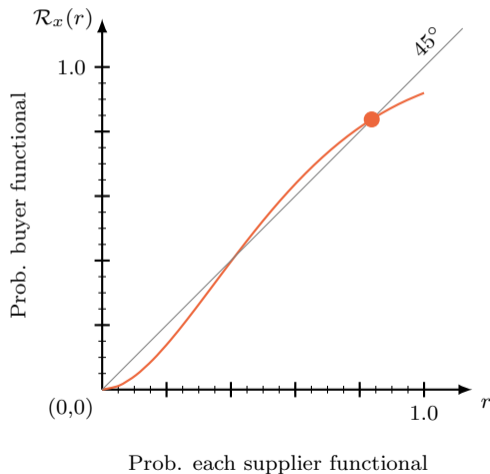
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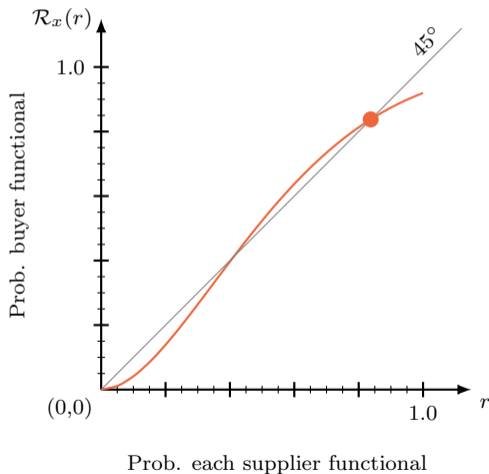
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Prob. *all* suppliers of a given input not available



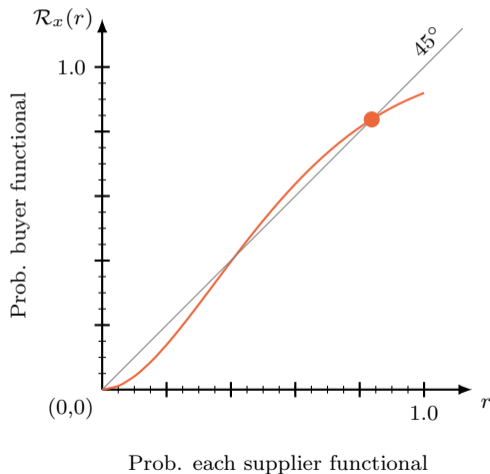
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Prob. there is a supplier of a given input available



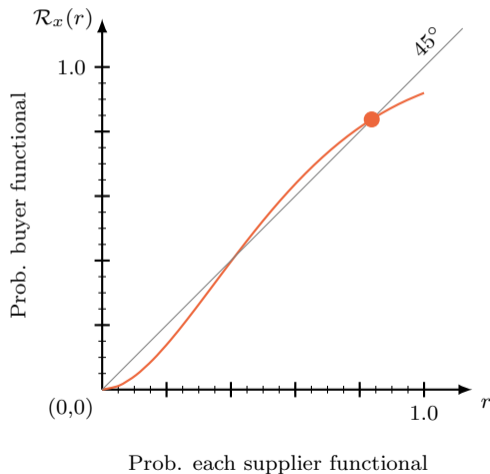
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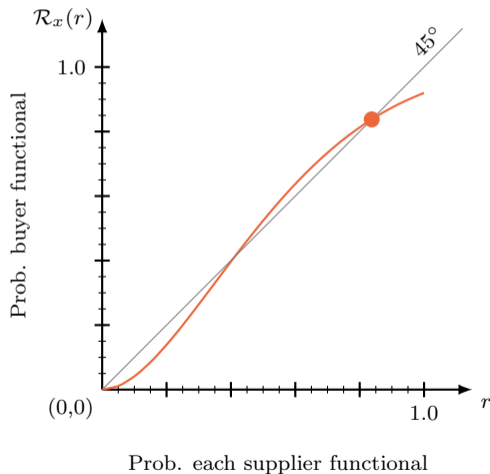
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**Fact.** For  $x \neq x_{crit}$  the **largest fixed point** of  $\mathcal{R}_x$  is equal to reliability as  $\mu \rightarrow \infty$ .





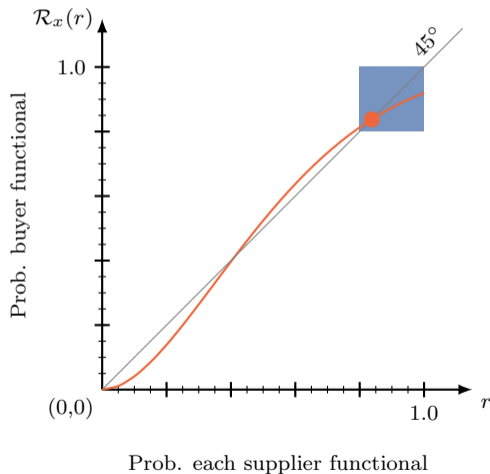
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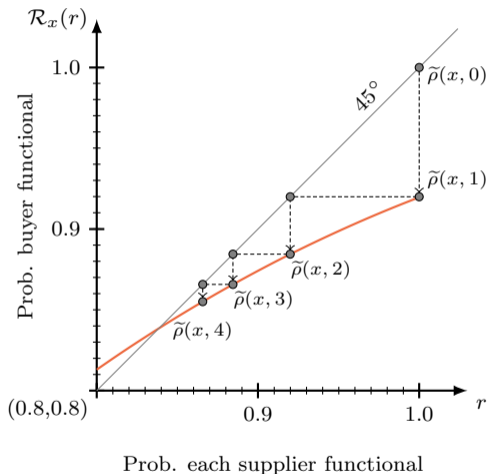
We will now zoom in on the area at the top right.



# Understanding the precipice

## Part 2: Computing reliability – an iteration

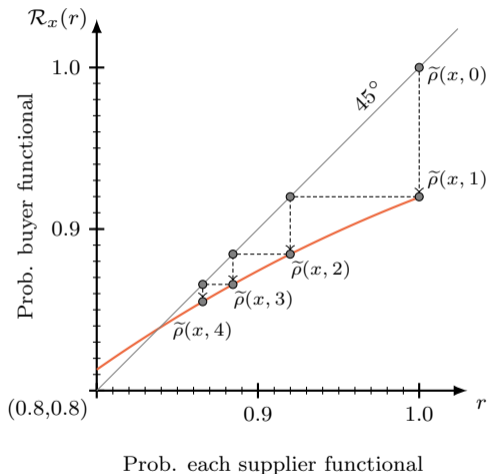
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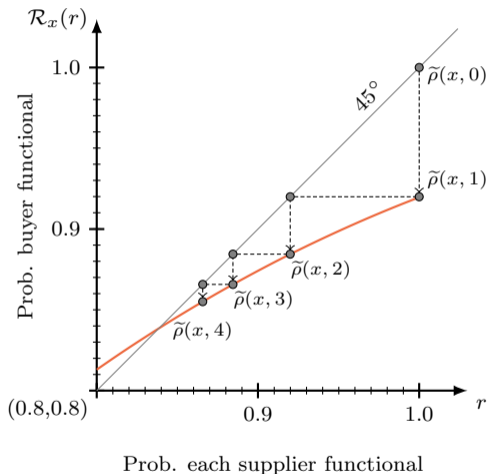
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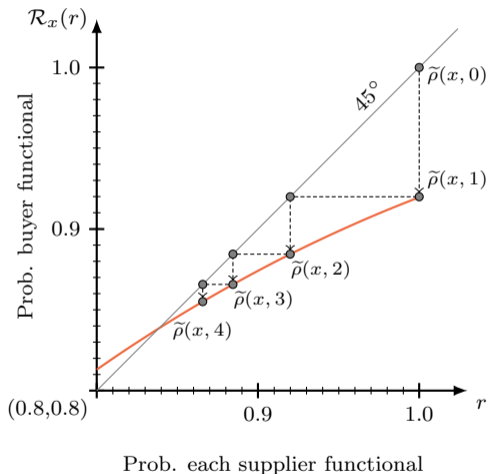
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- Now continue iteratively.



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- Start with reliability of most upstream suppliers,  $\tilde{\rho}(x, 0) = 1$ .
- Plug that into  $\mathcal{R}_x$  and call the output  $\tilde{\rho}(x, 1) = \mathcal{R}_x(\tilde{\rho}(x, 0))$ .
- Now continue iteratively.
- Observe that it takes only a few steps to get quite close to the largest fixed point of  $\mathcal{R}_x$ .



# Understanding the precipice

Part 3: How the largest fixed point depends on  $x$

$$x = 0.7$$

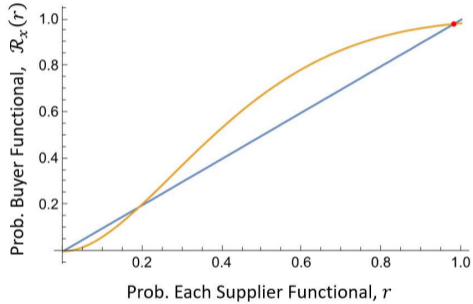
Prob. Buyer Functional,  $\mathcal{R}_x(r)$

Prob. Each Supplier Functional,  $r$

# Understanding the precipice

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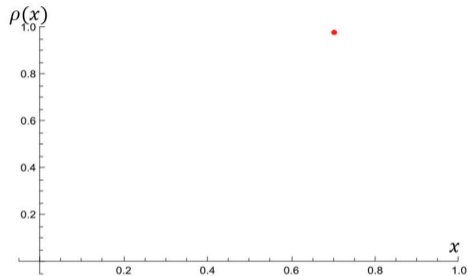
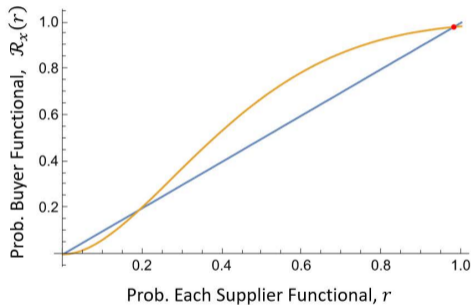
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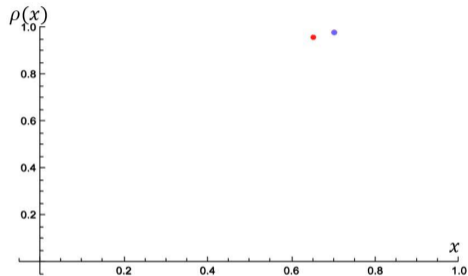
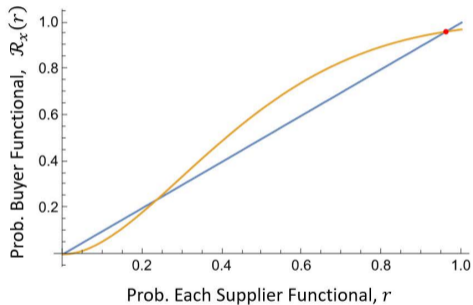




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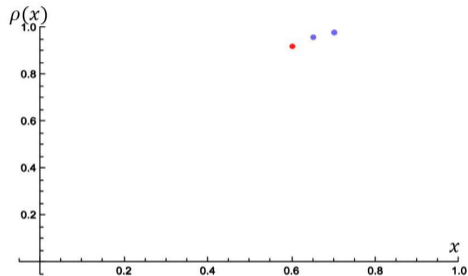
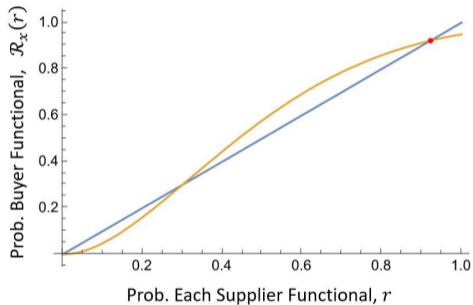
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# Understanding the precipice

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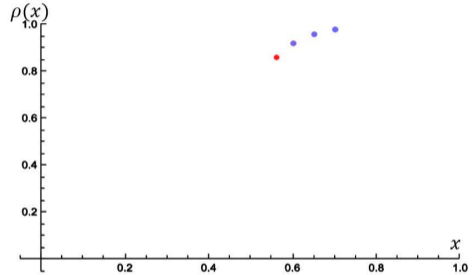
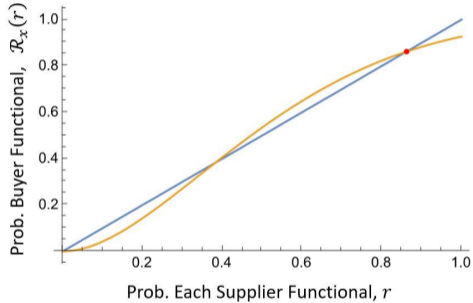
$$x = 0.6$$



# Understanding the precipice

## Part 3: How the largest fixed point depends on $x$

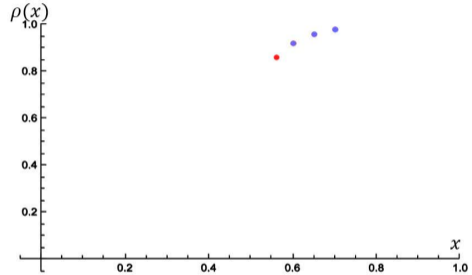
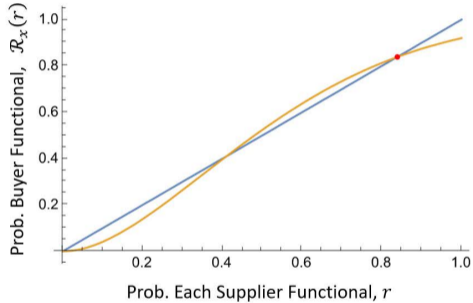
$$x = 0.56$$



# Understanding the precipice

## Part 3: How the largest fixed point depends on $x$

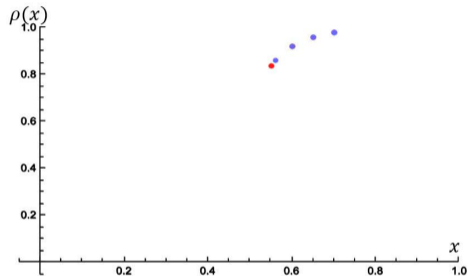
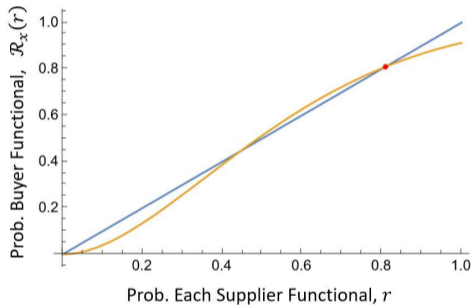
$$x = 0.55$$



# Understanding the precipice

Part 3: How the largest fixed point depends on  $x$

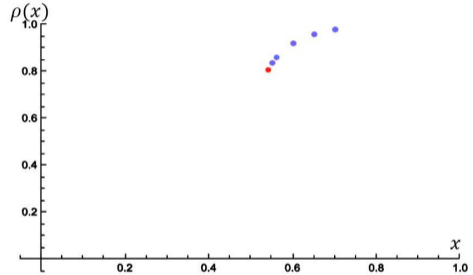
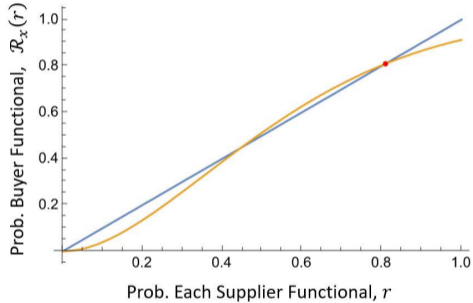
$$x = 0.54$$



# Understanding the precipice

Part 3: How the largest fixed point depends on  $x$

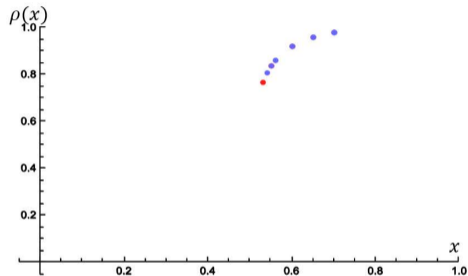
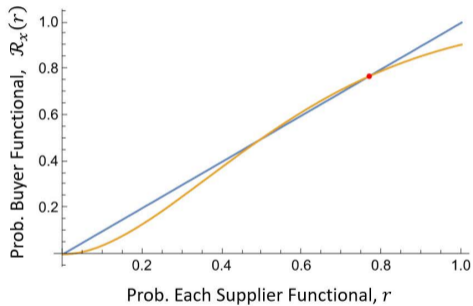
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# Understanding the precipice

Part 3: How the largest fixed point depends on  $x$

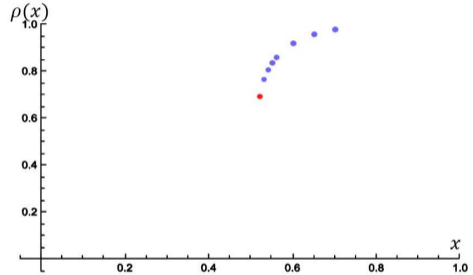
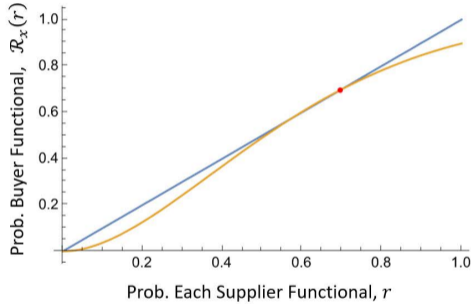
$$x = 0.53$$



# Understanding the precipice

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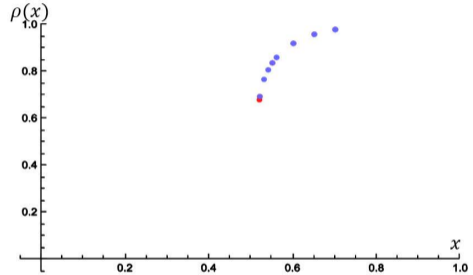
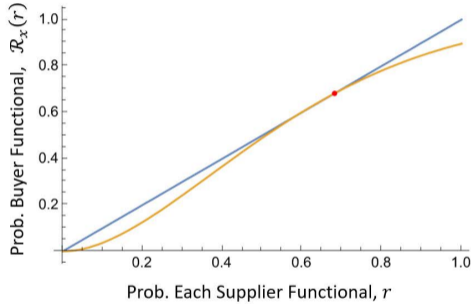




# Understanding the precipice

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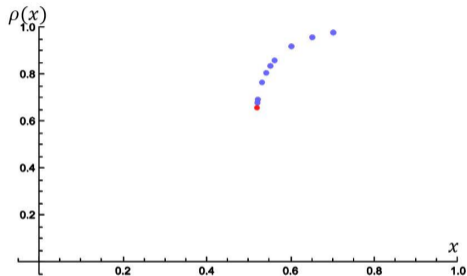
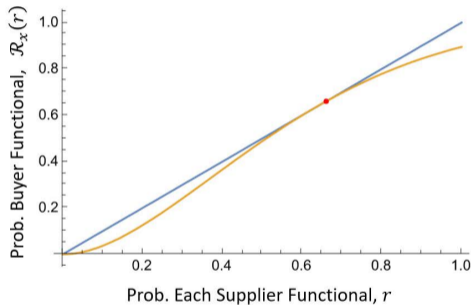
$$x = 0.519$$



# Understanding the precipice

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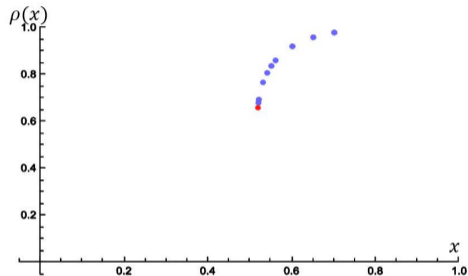
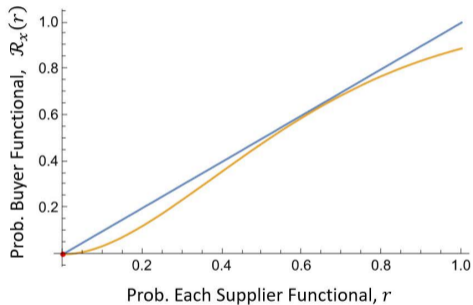
$$x = 0.518$$



# Understanding the precipice

## Part 3: How the largest fixed point depends on $x$

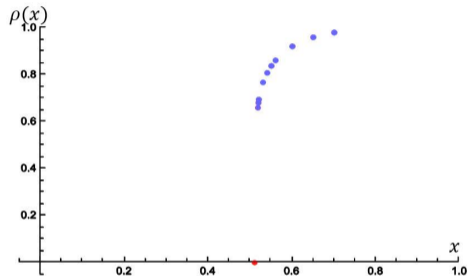
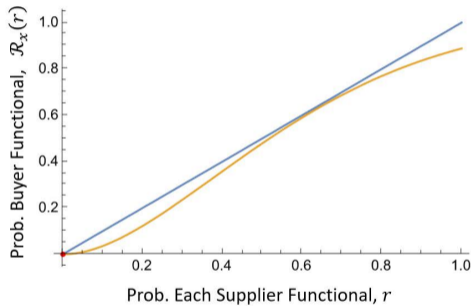
$$x = 0.51$$



# Understanding the precipice

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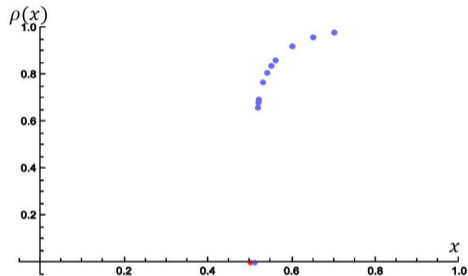
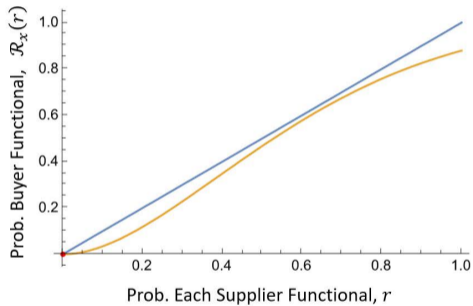
$$x = 0.51$$



# Understanding the precipice

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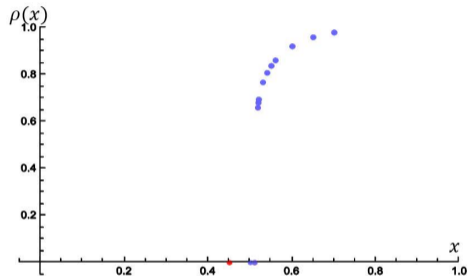
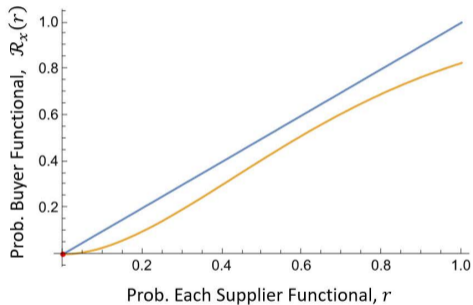
$$x = 0.5$$



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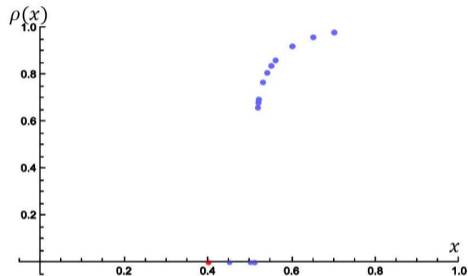
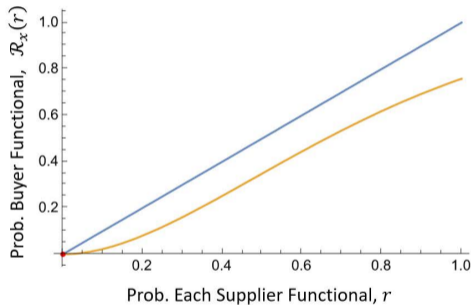
$$x = 0.45$$



# Understanding the precipice

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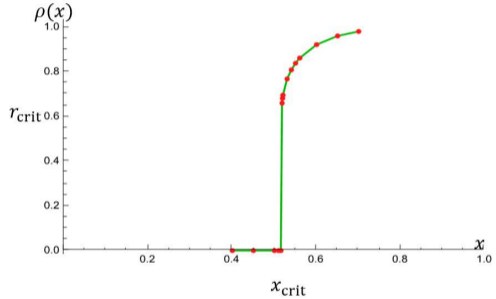
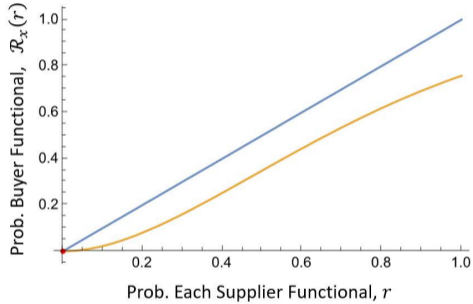
$$x = 0.4$$



# Understanding the precipice

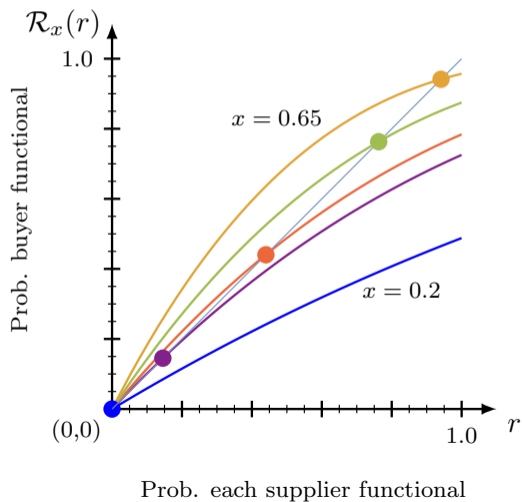
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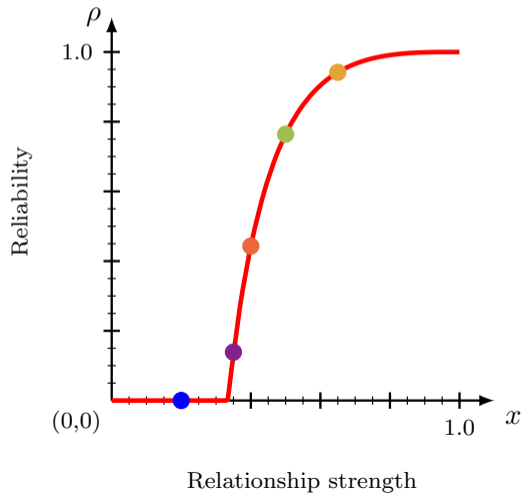
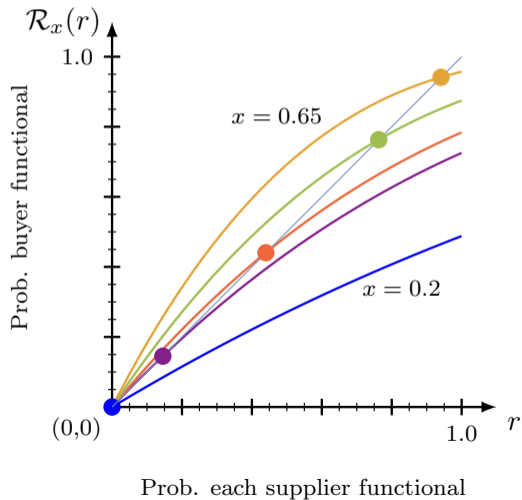




# Contrast with simple production: One input per step, No precipice



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# Network formation: Endogenous choice of $x$

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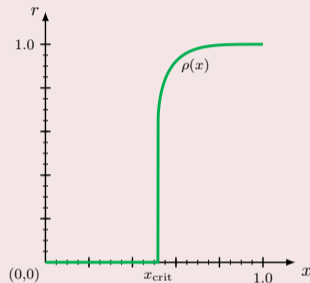
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► More

## QUESTION AND KEY NOTIONS



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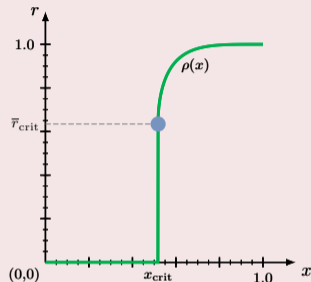
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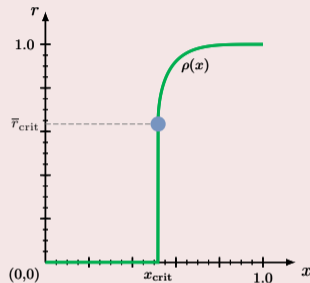
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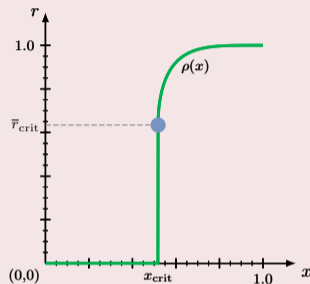
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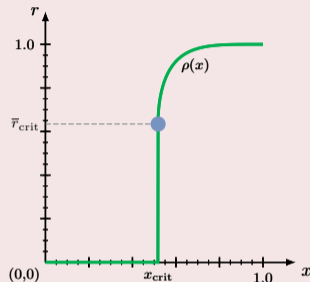
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► More

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If relationship strengths are chosen **efficiently**, will the supply network be on the precipice?

- No: very small improvements in reliability have arbitrarily large marginal returns.

When relationship strengths are chosen in **equilibrium**, will the supply network be on the precipice?

# Equilibrium definition

For a given  $\kappa$ , we say an outcome  $x \in [0, 1]$  is a symmetric undominated equilibrium (SUE) if

- **[each firm is optimizing]**: for gross profits  $\kappa g(\rho)$ , the investment level  $x_{if} = x$  for all firms  $if$  is a Nash equilibrium of the investment game ...

$$\left( \text{i.e., } x \text{ maximizes } \kappa g(\rho) P_{i \text{ functions}}(x_{if}; x) - c(x_{if}) \right)$$

- ... that maximizes total surplus among the symmetric Nash equilibria. **[efficient selection]**

We will focus on these.



# Network formation: Endogenous choice of $x$

## INVESTMENT EQUILIBRIUM ANALYSIS

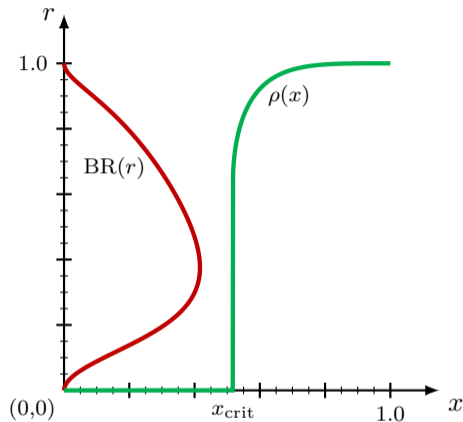
Recall: firms pay  $c(x_{if})$  to invest, receive  $\kappa g(\rho)$  if they are productive.

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As we vary the productivity multiplier  $\kappa$  on the returns to producing, look at how the best-response curve shifts.

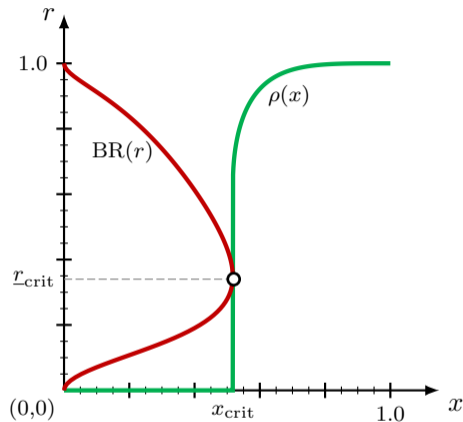


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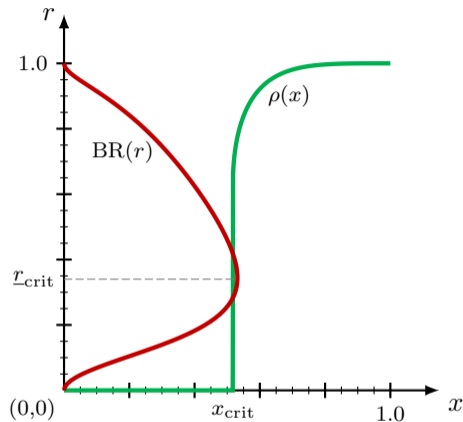


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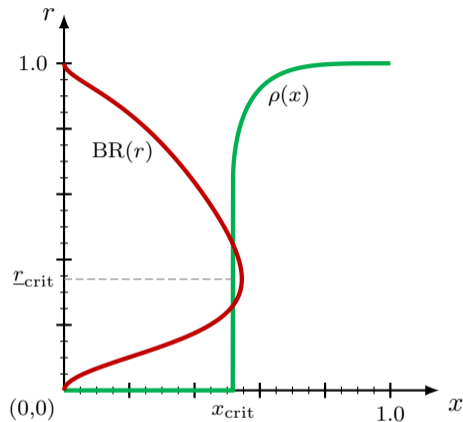


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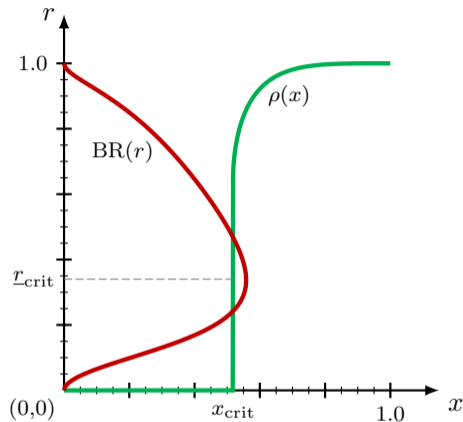


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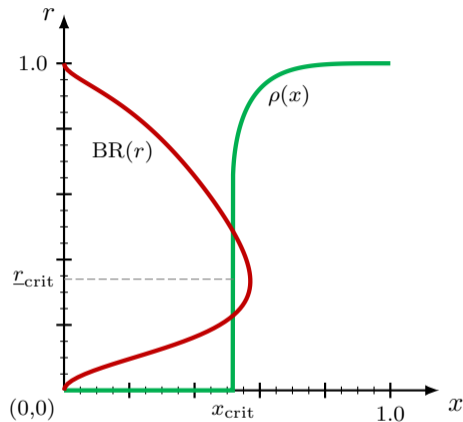


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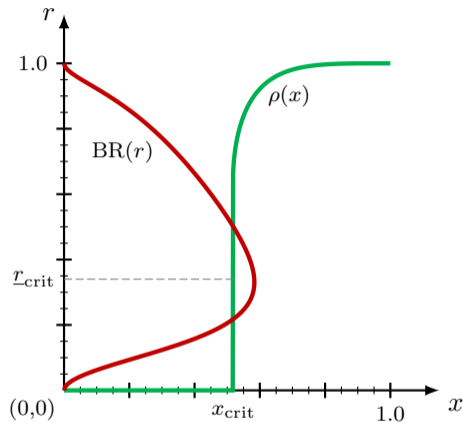


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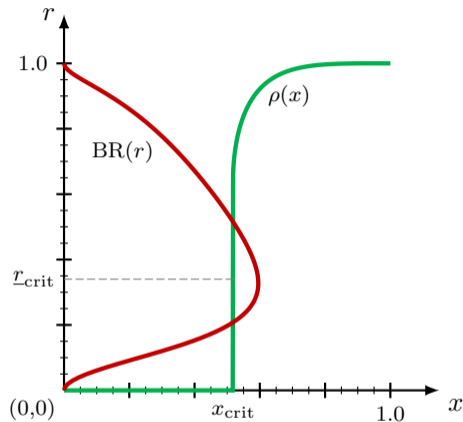


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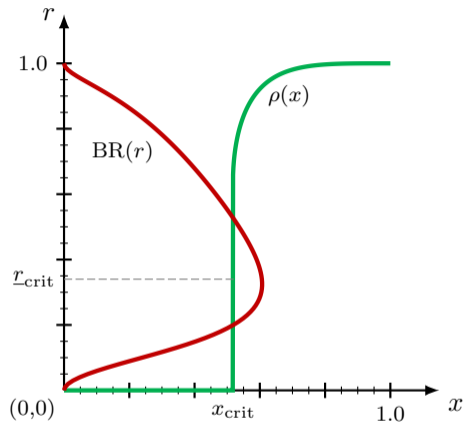


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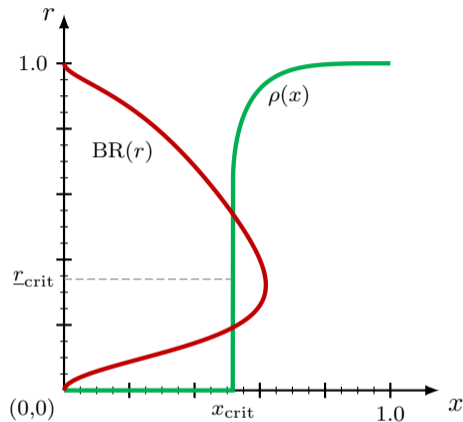


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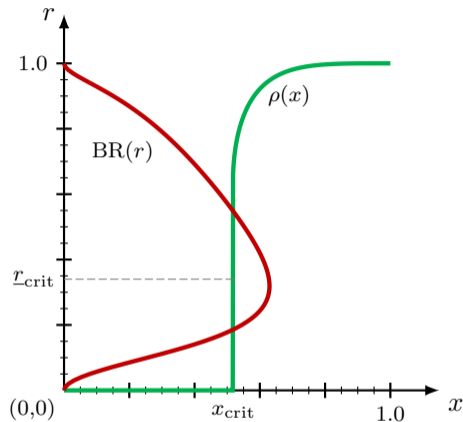


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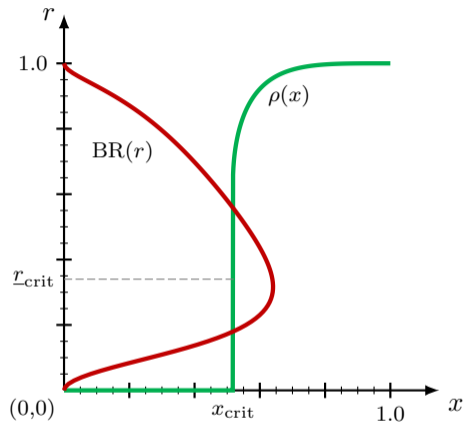


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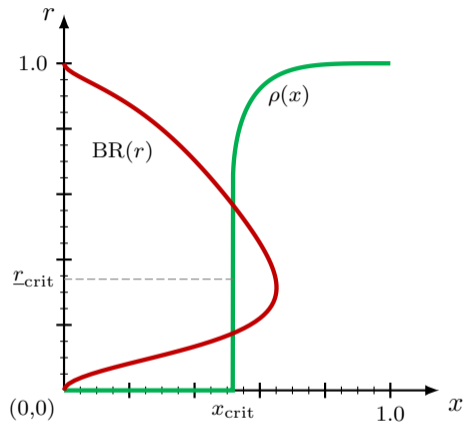


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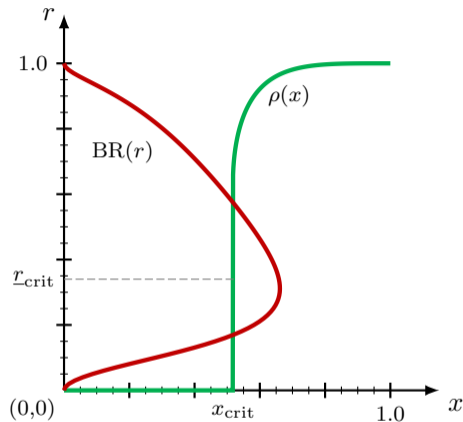


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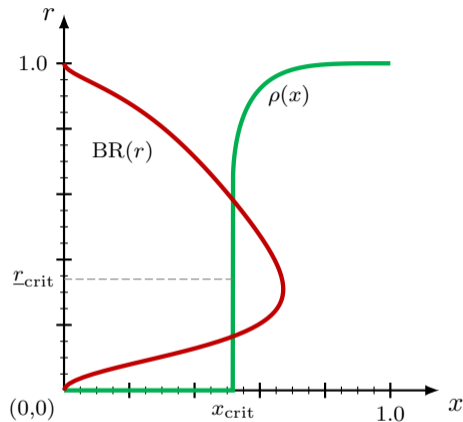


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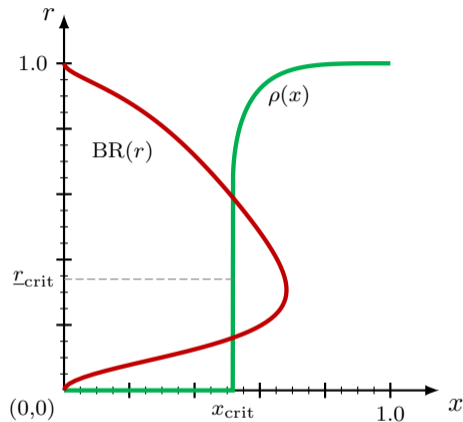


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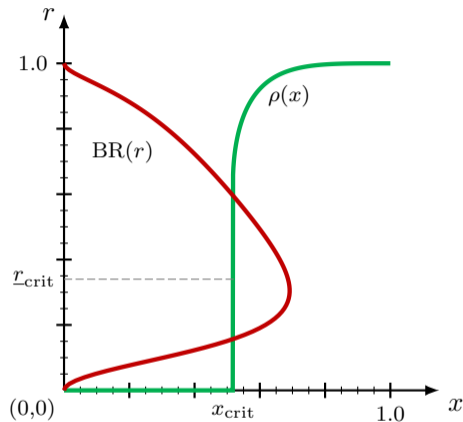


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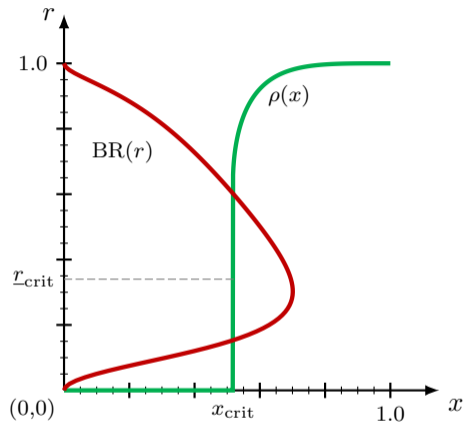


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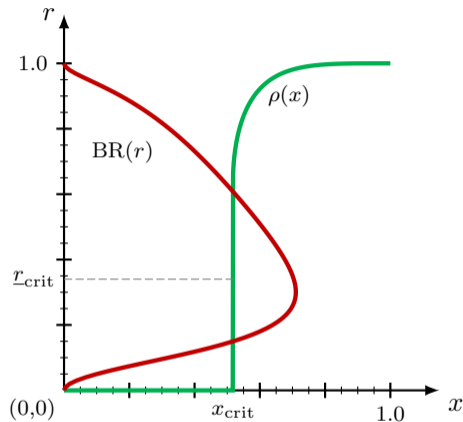


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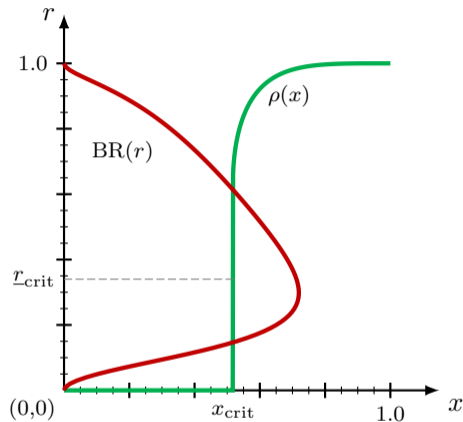


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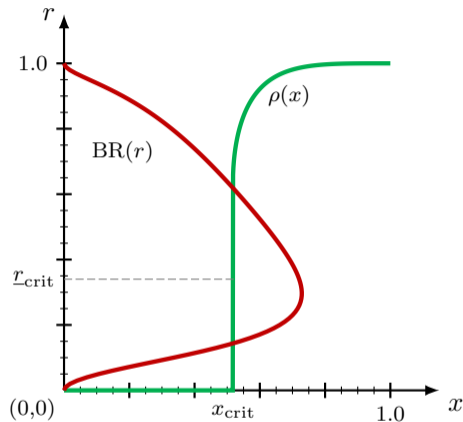


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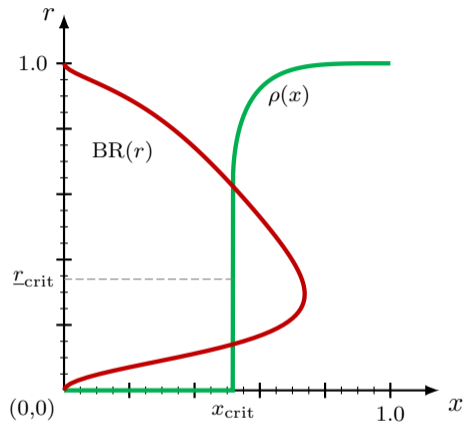
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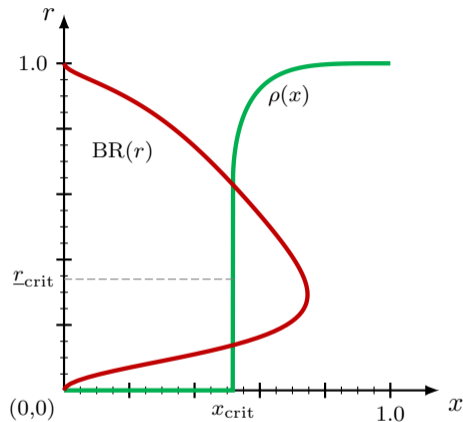
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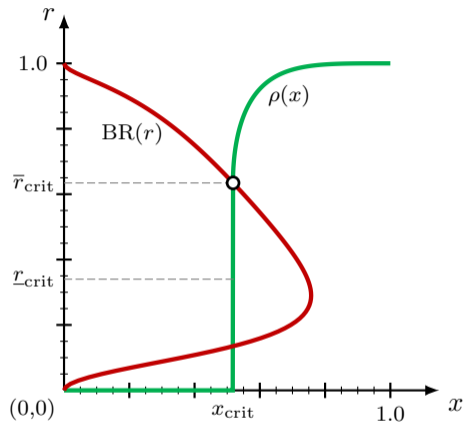
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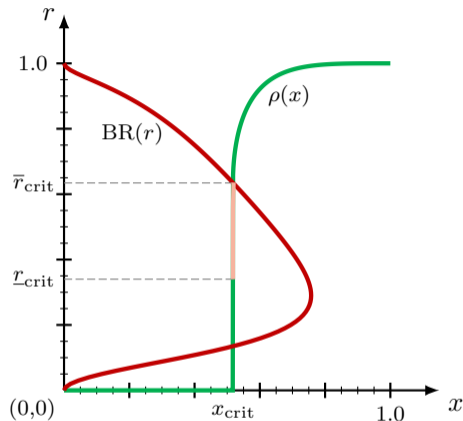
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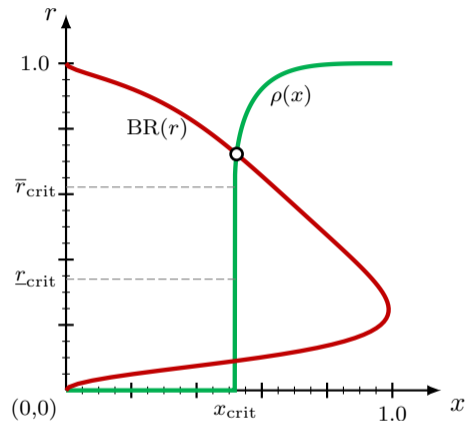
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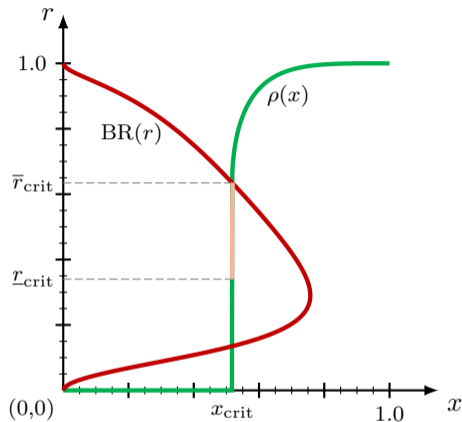
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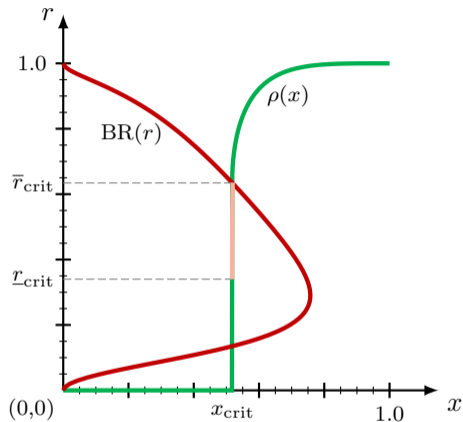
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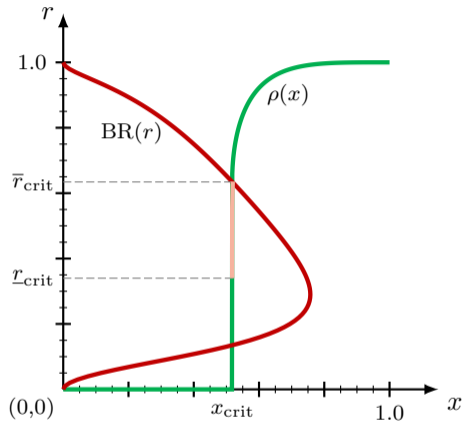
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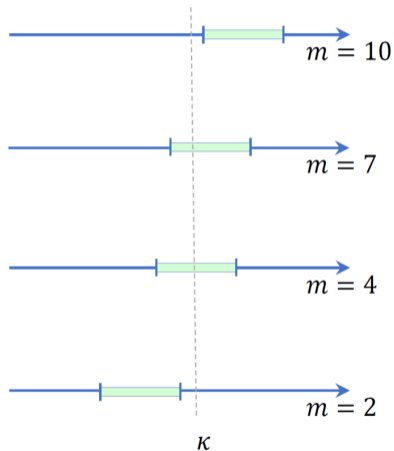
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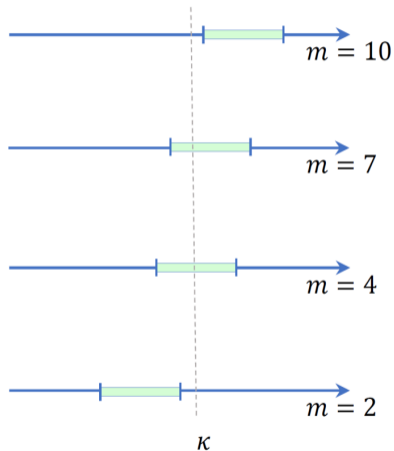




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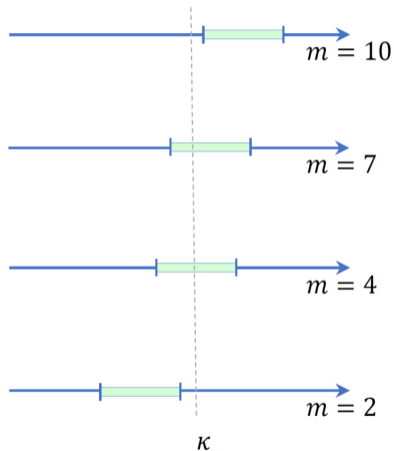


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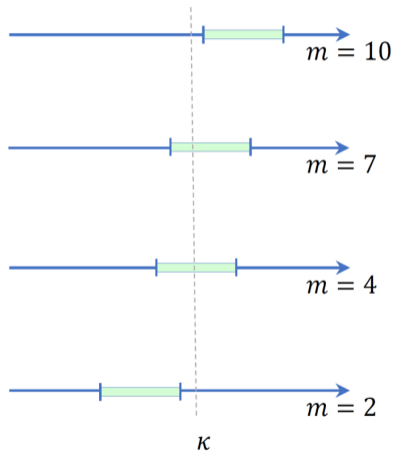
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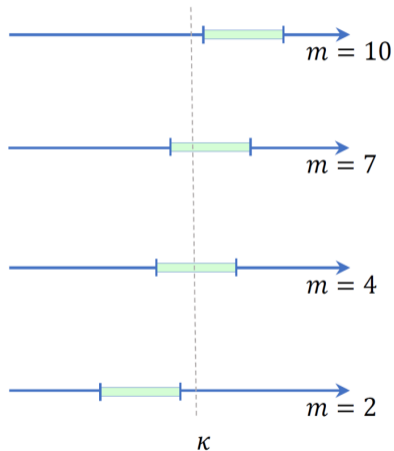
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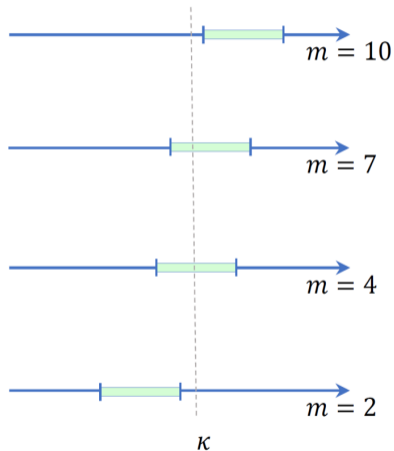
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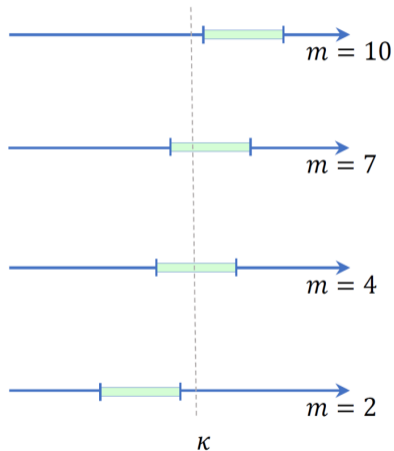
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Companion piece: Elliott and Golub “Networks and Economic Fragility” (ARE 2022). Underlying facts, survey of “extensive margin” forces in production networks.

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- Firms' profits (can be microfounded) are written as:

$$\Pi_{if} = \underbrace{\kappa g(x)}_{\text{gross profit}} \underbrace{P(x_{if}; x)}_{\text{prob. functional}} - \underbrace{c(x_{if})}_{\text{investment cost}}$$

- ▶  $P(x_{if}; x)$  – probability of producing when *others* play  $x$
- ▶  $c$  convex, increasing, Inada
- ▶  $g(x)$  decreasing in  $x$

# Model: Investment game

- Investment game: simultaneously, each firm  $if \in \mathcal{F}$ , makes investment  $x_{if} \in [0, 1]$  (probability each of its potential sourcing relationships work)
- We'll study symmetric equilibria ( $x_{if} = x$  for all  $if \in \mathcal{F}$ )
- Timing:
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- Which investment levels can occur in equilibrium?



## Related Literature

**Network formation theory, reliability, and risk:** e.g., Bala and Goyal (2000), Levine (2012), Goyal and Vigier (2014), Acemoglu, Ozdaglar and Tahbaz-Salehi (2015), Brummitt et al. (2017), Elliott, Georg and Hazell (2018), Erol (2018), Erol and Vohra (2018), Talamàs and Vohra (2018), Bimpikis, Candogan, and Ehsan (2019), Dasaratha (2020).

Our contribution: A tractable network formation model for large complex supply networks with new features.

**Complementarities in production and their implications:** e.g., Kremer (1993), Blanchard and Kremer (1997), Ciccone (2002), Acemoglu, Antràs and Helpman (2007), Angeletos and Pavan (2007), Jones (2011), . . .

Our contribution: Possible concern—might actions that mitigate supply risks endogenously dampen the complementarities. We show they don't.

## Related Literature

**Production networks:** e.g., Long and Plosser (1983), Horvath (1998), Dupor (1999), Acemoglu, Carvalho, Ozdaglar, and Tahbaz-Salehi (2011), Elliott, Golub, and Jackson (2014), ... Taschereau-Dumouchel (2017), Boehm and Oberfield (2018) and König et al. (2019), Baqaee and Farhi (2019, 2020), Acemoglu and Tahbaz-Salehi (2020).

Our contribution: This literature focuses on smooth nonlinearities. We show how sourcing failures at the micro level give rise to discontinuities.

**Self-organizing criticality and phase transitions:** Jovanovic (1987), Scheinkman and Woodford (1994), an engineering/math lit. e.g., Buldyrev et al. (2010), Tang et al. (2016), and Yang et al. (2019).

Our contribution: Fully microfounded model that shows that the most severe phase transition occurs in the most classical production network setting (once you have our kinds of failures). In our setting economy is robust to idiosyncratic shocks.

# Examples of idiosyncratic disruptions

Fire at Philips Semiconductor halted production, preventing Ericsson from sourcing critical inputs, causing its production to also stop. Ericsson lost  $> \$100M$  in sales, subsequently exited mobile phone business (Norrman and Jansson, 2004).

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Two strikes at General Motors parts plants in 1998 led 100 other parts plants, and then 26 assembly plants, to shut down, reducing GM's earnings by  $> \$2.8B$  (Snyder et al. 2016).

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“It is tempting to think of supply chain disruptions as rare events. However, although a given type of disruption (earthquake, fire, strike) may occur very infrequently, the large number of possible disruption causes, coupled with the vast scale of modern supply chains, makes the likelihood that some disruption will strike a given supply chain in a given year quite high.” (Supply Chain Quarterly, 2018)

Resilinc found 1,069 supply chain disruption events globally during a six-month period in 2018.



# Why the Pandemic Has Disrupted Supply Chains

JUNE 17, 2021 • ARTICLES

By Susan Helper and Evan Soltas

**Figure 1. Businesses Have Little Inventory to Sell**

*Inventory-to-sales ratio (days of sales in inventory)*



Sources: U.S. Census Bureau; CEA Calculations

**Figure 2. Supply-Chain Disruptions By Sector**

*In the last week, did this business have domestic supplier delays? (percentage saying yes)*



Sources: U.S. Census Bureau; CEA Calculations.



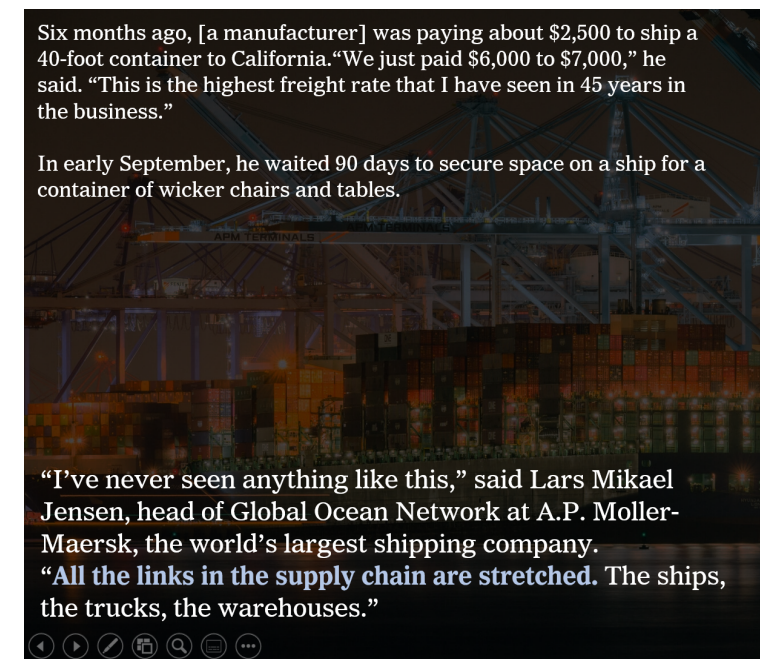
Q: What is the shock?

“ Around the planet, the pandemic has disrupted trade to an extraordinary degree, driving up the cost of shipping goods and adding a fresh challenge to the global economic recovery. The virus has thrown off the choreography of moving cargo from one continent to another.”

## *‘I’ve Never Seen Anything Like This’: Chaos Strikes Global Shipping*

The pandemic has disrupted international trade, driving up the cost of shipping goods and adding a fresh challenge to the global economic recovery.





Six months ago, [a manufacturer] was paying about \$2,500 to ship a 40-foot container to California. “We just paid \$6,000 to \$7,000,” he said. “This is the highest freight rate that I have seen in 45 years in the business.”

In early September, he waited 90 days to secure space on a ship for a container of wicker chairs and tables.

“I’ve never seen anything like this,” said Lars Mikael Jensen, head of Global Ocean Network at A.P. Moller-Maersk, the world’s largest shipping company.

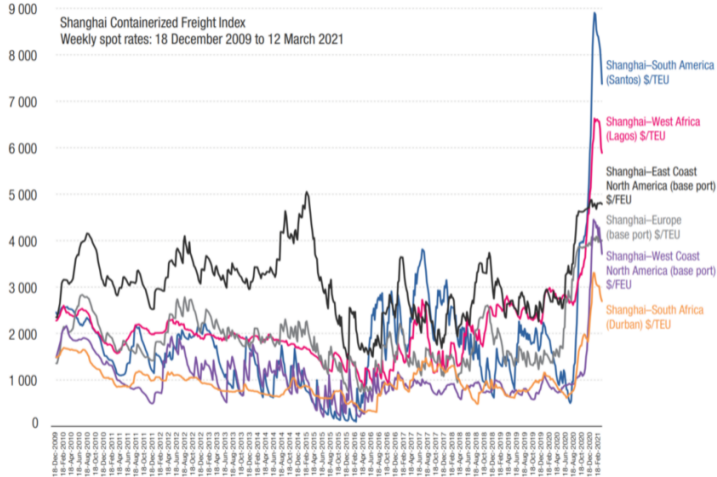
“**All the links in the supply chain are stretched.** The ships, the trucks, the warehouses.”

Pandemic shocks have led to many disruptions in the details of shipping.

- mismatch between containers and ships (emergency shipping left containers in places where ships rarely are);
  - adds 1000-mile Kolkata-Mumbai leg
- slowdowns at borders due to limited staffing (quarantines, childcare);
  - congested ports
- Containers going Eastward empty because of urgency.



# Shipping costs have spiked dramatically



Abbreviations: FEU, 40-foot equivalent; TEU, 20-foot equivalent.

Source: UNCTAD calculations, based on data provided by Clarksons Research.

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## Proposition

Suppose all complexities  $m_i \geq 2$ . Let  $x_{if,j} = X_{ij}(\xi)$ , where  $X_{ij} : [0, 1] \rightarrow [0, 1]$  is a strictly increasing  $C^1$  onto function and  $\xi$  is an economywide parameter (e.g., institutional quality). There is a critical  $\xi_{\text{crit}}$  such that  $\lim_{\tau \rightarrow \infty} \rho(\xi, \infty) = 0$  for all  $\xi < \xi_{\text{crit}}$  and  $\lim_{\tau \rightarrow \infty} \rho(\xi, \infty) > r_{\text{crit}} > 0$  for all  $\xi > \xi_{\text{crit}}$ .