

# Essays in the Economics of Networks

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Thesis defence  
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Two features of today's economies:

- ▶ long, interconnected **supply chains**;
- ▶ in many sectors **superstar firms** (market power?)

Two features of today's economies:

- ▶ long, interconnected **supply chains**;  
(Berlingieri (2013), Alfaro et al, 2019, ...)
- ▶ in many sectors **superstar firms** (market power?)  
(De Loecker and Eeckhout (2020), Autor et al. (2020), ...)

### **Big picture:**

How do input-output connections matter for competition policy?

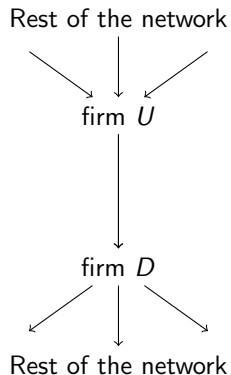
**This paper:** A tractable model of competition such that:

- ▶ network and technology determine **both** size and split of the surplus;
- ▶ firms strategically exploit their position in the supply chain.

**Goal:** provide a tool to assess market power: e.g. evaluate mergers.

- ▶ market power+network interesting for business cycles, monetary policy,...

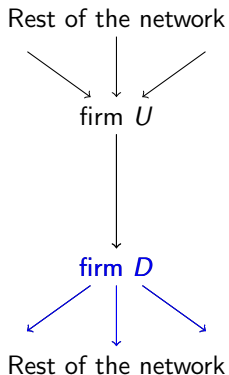
# Main contributions



How to model market power in firm-to-firm trade?

- ▶ e.g. firms set the price -

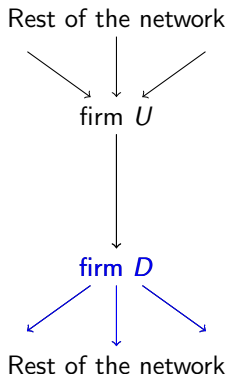
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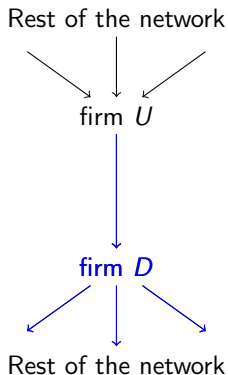
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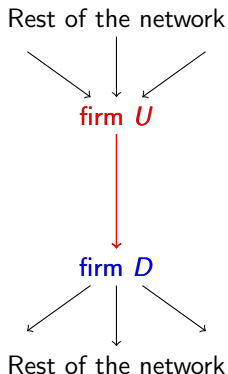
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- ▶ e.g. firms set the price - **output**?
- ▶ **network** → firms are both **buyers** and  **sellers**
- ▶ **but** also firms in *U* “want” to set the price;



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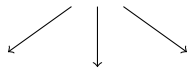
Rest of the network



**firm U**



**firm D**



Rest of the network

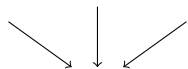
## Common approach:

▶ market power on one side: **inputs** or output;

Carvalho et al. (WP), Hart and Tirole (1990), Grassi (WP)

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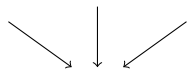
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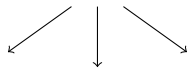
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## Common approach:

- ▶ market power on one side: inputs or output;  
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## This paper:

- ▶ market power on inputs and outputs, endogenously;

Important to assess **relative** market power:

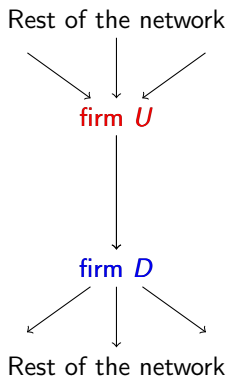
- ▶ choice of market where firms have power **changes predictions**

# Main contributions

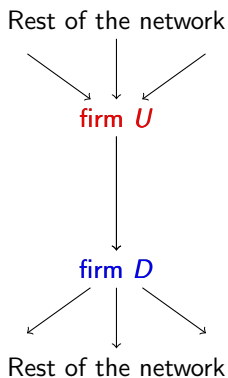
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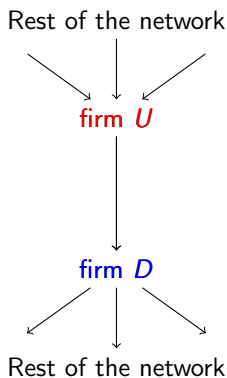
## This paper:

- ▶ firms exploit strategically network position;

Important for **aggregate** welfare impact of oligopolies:

- ▶ **market power is stronger** than if they don't (final price larger)

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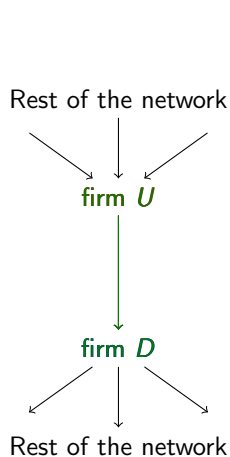
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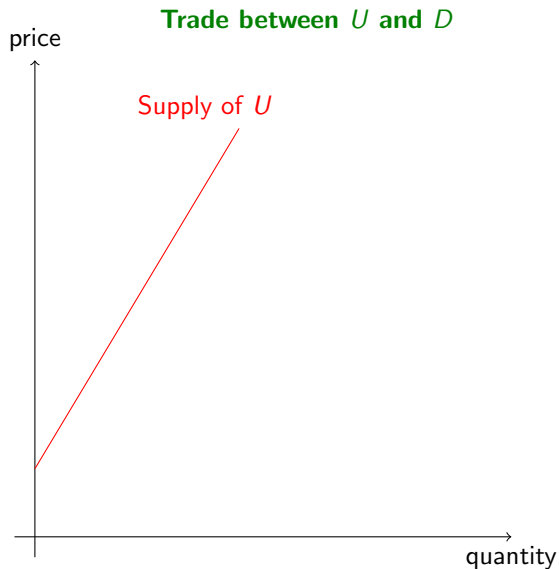
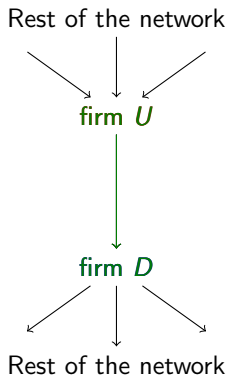
How? competition in **supply and demand functions**

# Main contributions - S&D equilibrium

Trade between  $U$  and  $D$

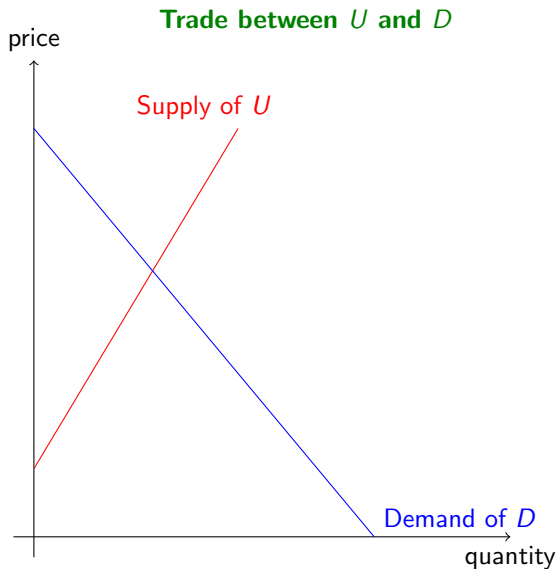
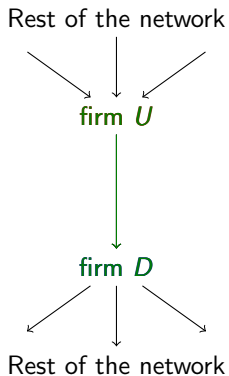


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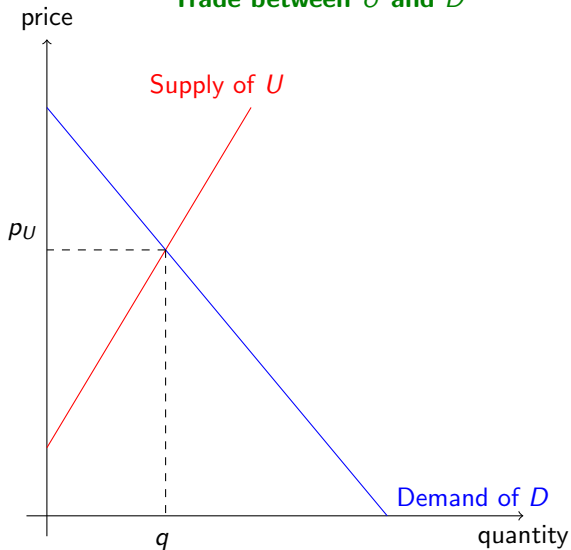
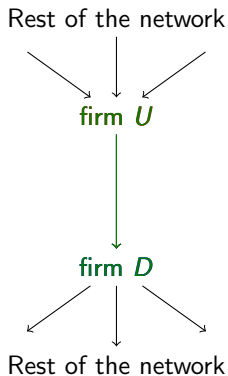


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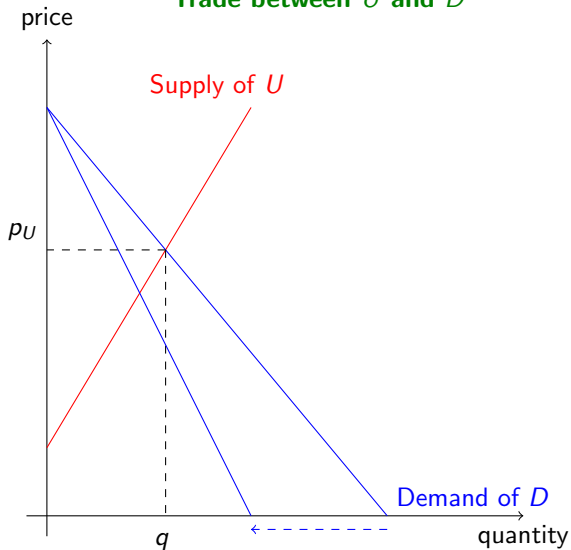
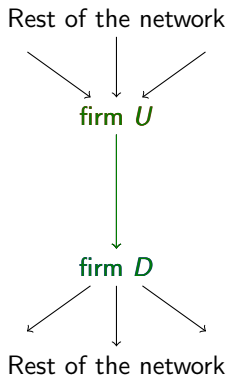
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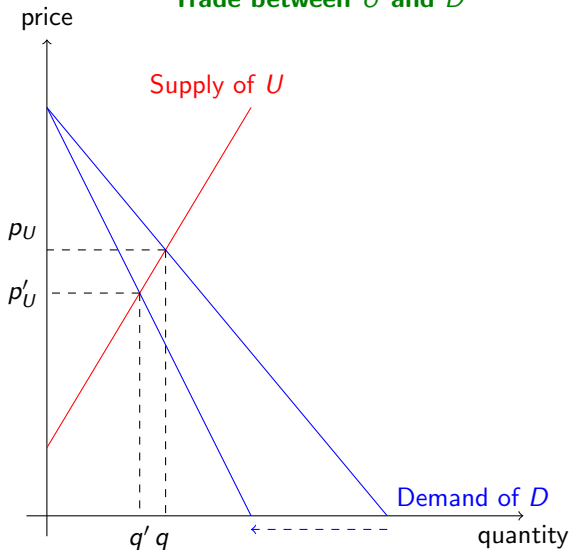
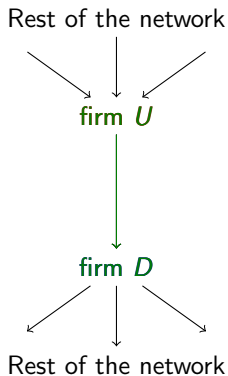
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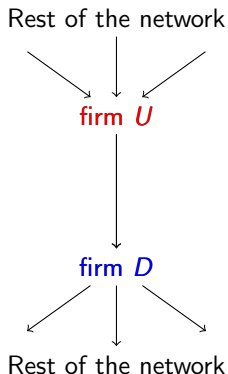


# Main contributions - S&D equilibrium

Trade between  $U$  and  $D$



# Main contributions



Supply and demand functions:

- ▶ physically used in e.g. finance, electricity auctions;
- ▶ here: any arrangements (contractual, managerial) that specify how firm reacts to different conditions in the market.

# Results

- ▶ Existence for **any network** (e.g. sequential models need acyclic);
- ▶ **Horizontal mergers** always increase the final price;
  - ▶ even if **countervailing power** (Stigler ('52), Loertscher and Marx (WP));
- ▶ Final price **smaller** if firms neglect network (“macro” approach);
- ▶ (In a line) if market power only on outputs/inputs:
  - ▶  $\implies$  **opposite** predictions on **markups**;
- ▶ Feasible algorithm to solve model numerically;
- ▶ **in progress**: proof of concept on US IO network.

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## Related literature

### **Market power and efficiency (macro):**

**production networks** Acemoglu and Tahbaz-Salehi (WP), Grassi (WP), Kikkawa et al. (2020), Baqaee (2019), Baqaee and Farhi (2019, 2020), Pasten et al. (2018), Carvalho et. al (WP);

**no input-output** Pellegrino (WP), Azar and Vives (2020);

### **Market power and efficiency in networks:**

**mergers** Loertscher and Marx (WP), Hinnosaar ('19); Bimpikis et al. ('20), Hart and Tirole ('90), Salinger ('90);

**bargaining** Condorelli et al. ('17, WP), Kotowski and Leister ('19), Manea ('18);

**matching** Hatfield et al. ('12), Fleiner et al. ('20), Fleiner et al. ('19);

### **Supply function competition/double auctions:**

**Supply function competition** Klemperer and Meyer (1989), Green and Newbery (1992), Vives (2011);

**Finance microstructure** Kyle (1989), **Malamud and Rostek (2017);**

**Auctions** Ausubel et al. (2014), Woodward (WP).



# Plan

## Model

## Results

- Existence

- Horizontal mergers

- Relative market power

- Aggregate impact of market power

# Setting I

## Firms

- ▶  $i = 1, \dots, N$  sectors,  $\alpha = 1, \dots, n_i$  **homogeneous** firms per sector;
- ▶ firms need specific goods as inputs - this defines the *input-output network* (exogenous);
- ▶ every link is a market - **customized** prices (Dhyne et al. (WP));
- ▶ **For ease of exposition:** 1 customer per sector (network is a **tree**).

## Consumers

- ▶ continuum - **price taker representative consumer**
- ▶ consumers provide labor ( $L$ ) and own the firms;
- ▶ competitive labor market: wage **taken as given** (normalized to 1).

Two assumptions allow tractability:

- ▶ **stochastic productivity** → unique best reply;
- ▶ **specific functional form** → linear schedules;

Analogous to most models with supply/demand functions (e.g. Klemperer and Meyer (89)).

## Setting II - Parametric assumptions

The profit of firm  $\alpha$  in sector  $i$  is:

$$\pi_{i\alpha} = p_i \left( \sum_j \omega_{ij} q_{i\alpha,j} \right) - \sum_j p_j q_{i\alpha,j} - \underbrace{\left( \varepsilon_i \sum_j q_{i\alpha,j} + \frac{1}{2} \sum_j q_{i\alpha,j}^2 \right)}_{\text{Amount of labor hired}}$$

where  $\varepsilon_i$  is a **labor productivity shock**.

- ▶ Can be rationalized through a production function: Technology
- ▶ inputs **nor substitutes nor complements** generalization

**Consumers:**  $\frac{A_c + \varepsilon_c}{B_c} C - \frac{1}{2} \frac{1}{B_c} C^2 - L$

$\varepsilon = (\varepsilon_1, \dots, \varepsilon_N, \varepsilon_c) \sim F$ ,  $\text{supp}F$  is a neighborhood of 0

# The Game I - Players and Actions

The firms play a **simultaneous** game  $\mathcal{G}$ .  $\varepsilon$  is realized at the end.

**Players** the **firms**;

**Actions** firm  $\alpha$  in sector  $i$  chooses a profile of:

- ▶ a supply function  $S_{i\alpha}$ ;
- ▶ demands for intermediate inputs  $D_{i\alpha} = (D_{i\alpha,j})_j$ ;

such that:

1. defined on  $(p_i, p_i^{in}, \varepsilon_i)$ ;
2. subject to the **technology constraint**:

$$S_{i\alpha}(p_i, p_i^{in}, \varepsilon_i) = \Phi_i(D_{i\alpha},) \text{ for any } (p_i, p_i^{in}, \varepsilon_i)$$

3. differentiable, p.d. Jacobian bounded away from 0; [details](#)

## The Game II - Payoffs

Payoffs  $u_{i\alpha} = \mathbb{E}\pi_{i\alpha}(p_i, p_i^{in}, \varepsilon_i, S_{i\alpha}(p_i, p_i^{in}, \varepsilon_i), D_{i\alpha}(p_i, p_i^{in}, \varepsilon_i))$

$p = ?$

## The Game II - Payoffs

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$p = ?$  The **prices** are determined solving the **market clearing equations**:

$$\sum_{\beta} D_{j\beta,k}(p_j, p_j^{in}, \varepsilon_j) = \sum_{\alpha} S_{k\alpha}(p_k, p_k^{in}, \varepsilon_k) \quad \text{if } k \text{ sells to } j$$

$$A_c + \varepsilon_c - B_c p_c = \sum_{\beta} S_{0\beta}(p_c, p_0^{in}, \varepsilon_0) \quad \text{for final output producer}$$

**Global implicit function theorem** yields a function  $p^*(\varepsilon)$ .

# Supply and Demand Function Equilibrium

I will use shocks  $\varepsilon = ((\varepsilon_i)_i, \varepsilon_c)$  as **selection device**. Formally:

Consider a sequence of rv  $\varepsilon^n \sim F^n$  such that  $\bigcap_n \text{supp} F^n = \{0\}$ , and consider the relative game  $\mathcal{G}^n$ , as above.

a **Supply and Demand Function Equilibrium** is a profile of prices  $(p_i)_i$  and quantities  $(q_{i\alpha})_{i\alpha}$  that arise in the Nash equilibrium of  $\mathcal{G}^n$  for  $n \rightarrow \infty$ .

Reminiscent of **Trembling-hand equilibrium**.



# Symmetric Linear Equilibrium

A **symmetric linear equilibrium** is a profile of functions  $(D_{i\alpha})_{\alpha,j}$  defined in open sets  $\mathcal{O}_i$  such that:

- ▶ is a Nash equilibrium of  $\mathcal{G}^n$  for  $n$  large enough;
- ▶ firms in same sector behave identically:  $\forall \alpha D_{i\alpha,j} = D_{ij}$ ;
- ▶ they are **linear**, that is for all links where there is trade:

$$D_i = B_i \begin{pmatrix} \vdots \\ \omega_{ij} p_i - p_j \\ \vdots \end{pmatrix} + \varepsilon_i B_{i,\varepsilon} \quad B_i \text{ symmetric positive definite}$$

details

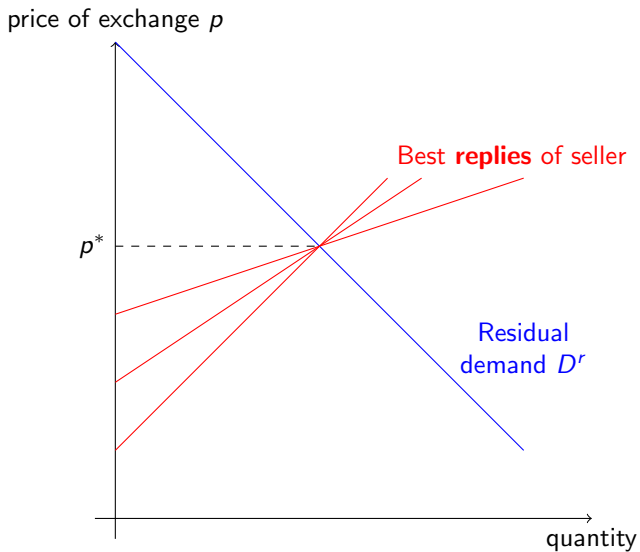
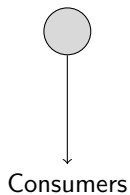
- ▶  $(p^*(0), 0) \in \cap_i \mathcal{O}_i$ .

# How to solve it?

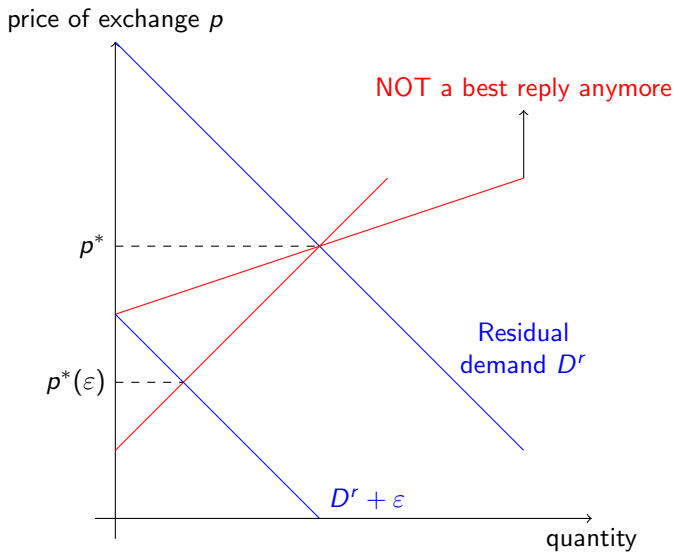
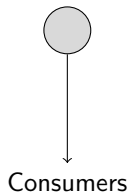
Two steps:

- ▶ best reply problem equivalent to **ex-post price setting** against residual demand (and supply) (Klemperer and Meyer '89);
- ▶ → back up residual demand and supply from market clearing.
  - ▶ where **network** comes into play.

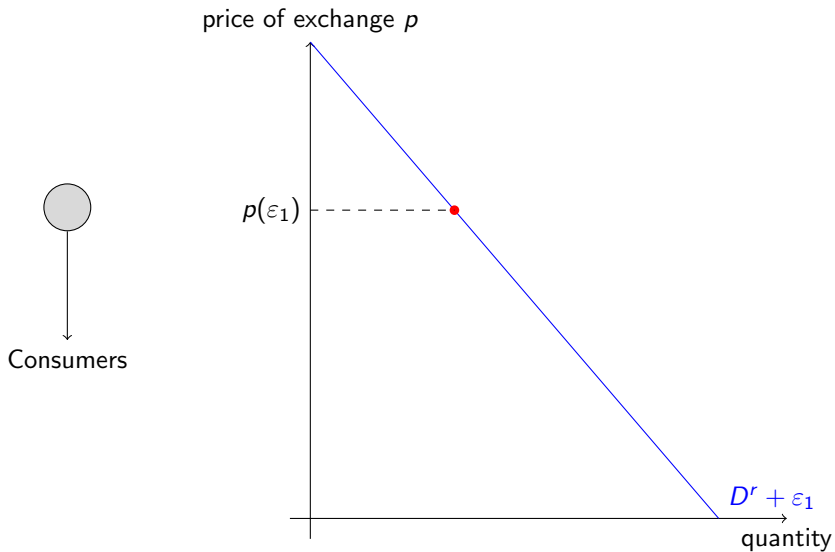
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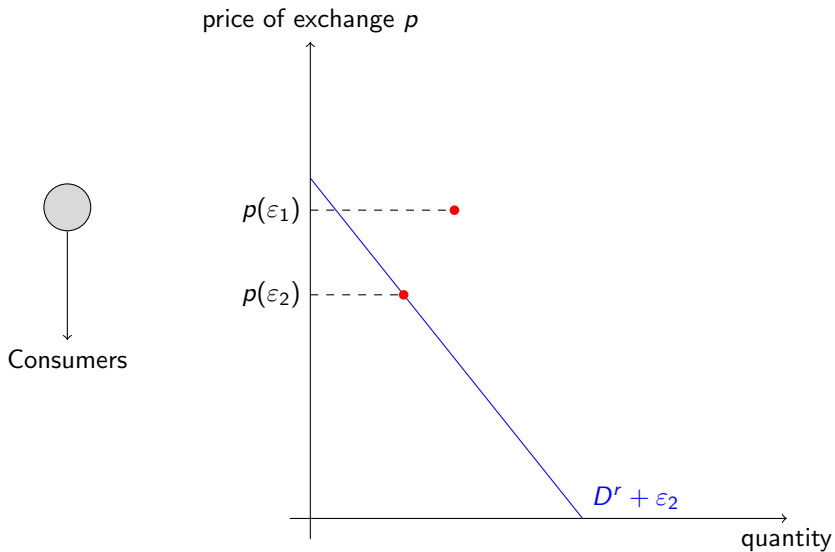
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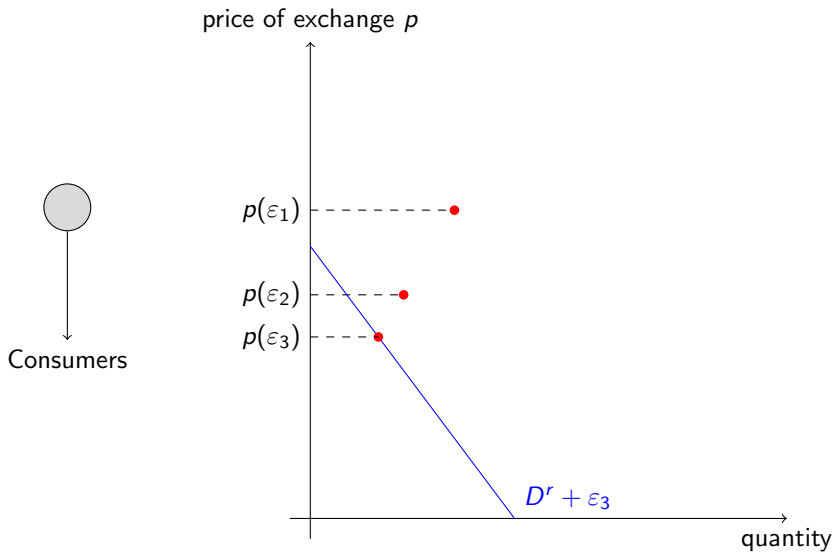
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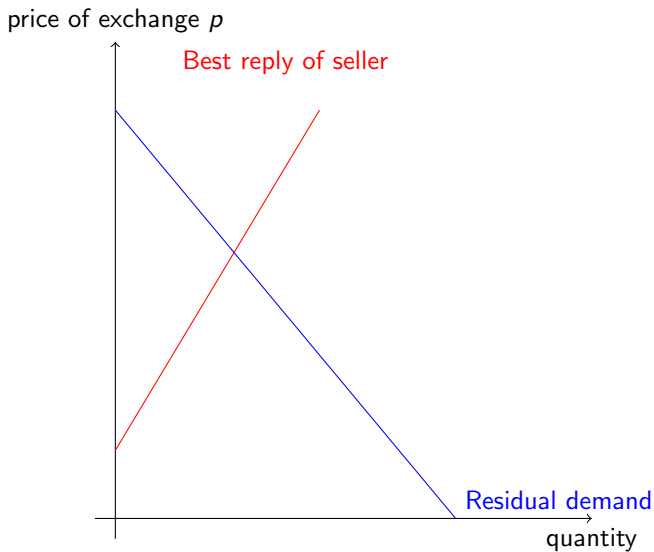
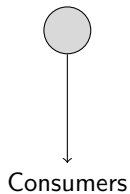
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## Solution II - Residual demand

Focus on firm  $\alpha$  in 0.

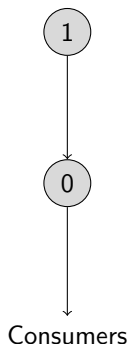
- ▶ Assume all other firms play **linear** schedules:

$$S_1 = B_1(p_1 - \varepsilon_1)$$

$$S_0 = B_0(p_0 - p_1 - \varepsilon_0)$$

To compute its best reply, firms in 1 compute:

$$\max_{p_1} \pi_{1\alpha}(p_1, D^r(p_1, \varepsilon_0), \varepsilon_1)$$



## Solution II - Residual demand

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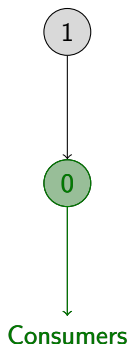
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where:

$$D^r(p_1) = \underbrace{n_0 B_0(p_0^* - p_1 - \varepsilon_0)}_{\text{Demand from 0}} - \underbrace{(n_1 - 1) B_1(p_1 - \varepsilon_1)}_{\text{Supply of competitors}}$$

$p_0^*(p_1)$  got from **market clearing in final market**



## Solution II - Residual demand

Market clearing conditions are a **linear system**:

$$Mp = \mathbf{A} \quad \text{where } M = f((B_i)_i)$$

Partially solving we get the **residual demand and supply**:

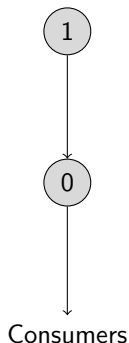
$$\begin{pmatrix} D_i^r \\ S_i^r \end{pmatrix} = A_i(\varepsilon) - \Lambda_i^{-1} \begin{pmatrix} p_i^{out} \\ -p_i^{in} \end{pmatrix} - (n_i - 1)B_i \begin{pmatrix} p_i^{out} \\ -p_i^{in} \end{pmatrix}$$

$\Lambda_i$  is (endogenous) **price impact** of sector  $i$ :

- ▶ it represents amount of monopoly power in sector  $i$ .

Taking the first order conditions and solving:

- ▶ we get fixed point equation in coefficients.



# Equilibrium

In equilibrium the coefficients  $(B_i)_{i \in I}$  satisfy:



$$B_i = \left( C_i^{-1} + \underbrace{\left( (n_i - 1)B_i + \bar{\Lambda}_i^{-1} \right)^{-1}}_{\text{Deviation from perfect competition}} \right)^{-1}$$

- ▶  $\bar{\Lambda}_i$  **constrained price impact** (adjusted for technology constraint):

$$\bar{\Lambda}_i = \Lambda_i - \frac{1}{\tilde{u}' \Lambda_i \tilde{u}} \Lambda_i \tilde{u} \tilde{u}' \Lambda_i$$

where  $\tilde{u}' = (1, -\omega_i)$ .

- ▶  $C_i$  are the coefficients of a firm that **takes prices as given!**
- ▶ if  $n_i \rightarrow \infty$ , it converges to perfect competition limit.

# Existence

## Theorem

*A non-trivial linear symmetric Supply and Demand Function equilibrium exists in any network for generic values of  $\omega$ s if there are at least 2 firms per sector (sufficient condition);*

Key elements of the proof:

- ▶ strategic complementarities in **slopes**:  
best reply coefficient matrices increasing in psd ordering;
- ▶ this also yields an algorithm to solve it (iterating the best reply).

Proof

# Horizontal mergers are harmful for welfare

- ▶ an horizontal merger in sector  $i$  is a **decrease** in number of firms  $n_i$
- ▶ **simplification**: mergers don't change the set of active links.

## Proposition

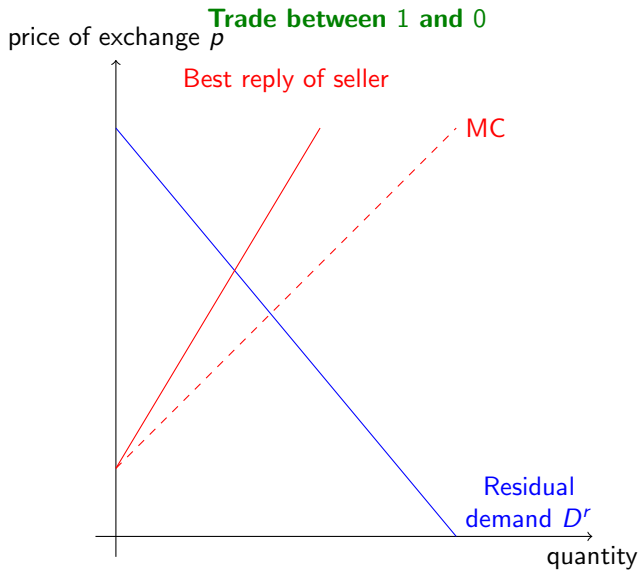
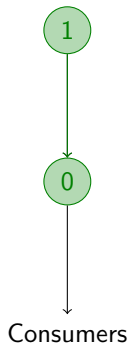
*In the maximal equilibrium, if there is just **one final good** any horizontal merger increases the price of the final good.*

Proof: strategic complementarities.

If network is a **line or regular tree**:

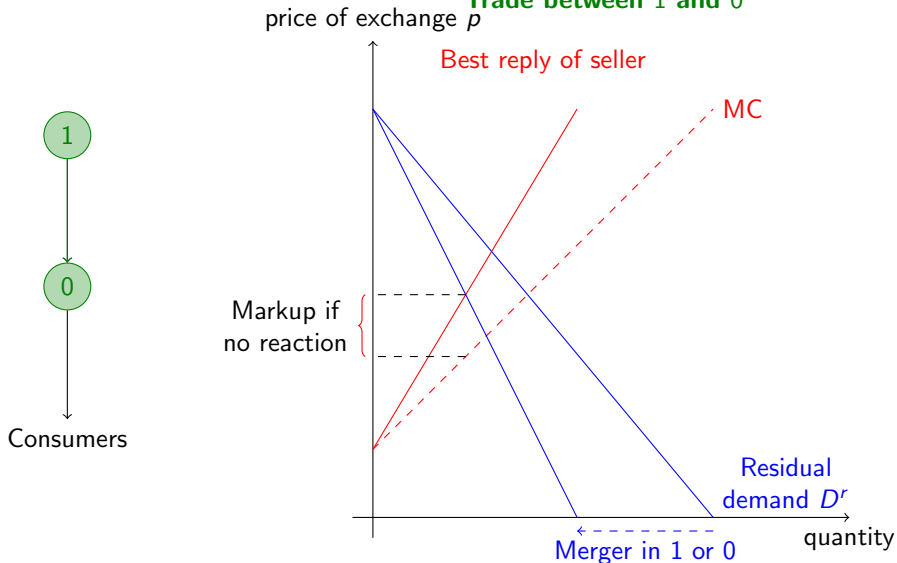
- ▶ any horizontal merger decreases total welfare.

# Mergers - intuition



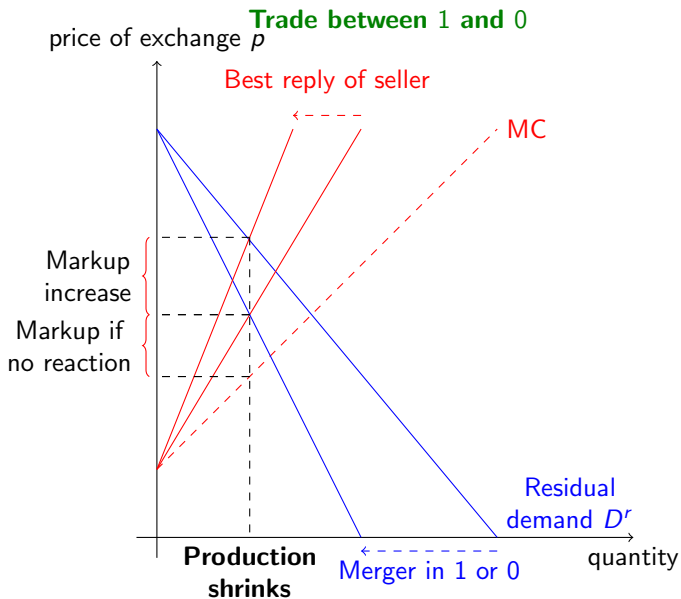
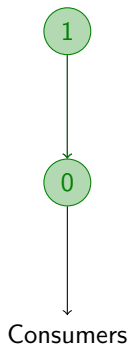
# Mergers - intuition

Trade between 1 and 0

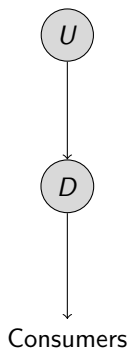




# Mergers - intuition



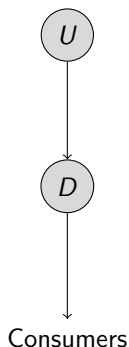
## Relative market power



Assume  $n_U = n_D$ ,  $\omega_U = \omega_D = 1$ .

In which sector firms have more market power?

# Relative market power



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In which sector firms have more market power?

“Classical” approach (Belleflamme and Peitz (2010), Salinger (1990)..)

► **Solve sequentially:**

1. firms in 1 and 2 choose output quantity (à la Cournot);
2. firms in sector 0 do the same, **taking input price as given.**

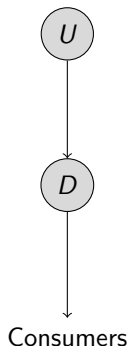
► **Prediction:** firms in  $U$  have larger markup and profit;

## Relative market power

Mechanism:

- ▶ only  $U$  takes **pass-through** into account.

In general production networks who “moves first?” /  
“takes price as given?”



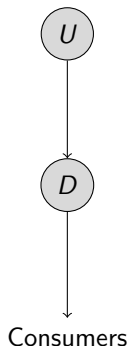
If firms set **input** quantities, in reverse order → **reverse predictions!**

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If firms set **input** quantities, in reverse order → **reverse predictions!**

- ▶ in S&D equilibrium firms are symmetric, but for **network position** and **technology**.
- ▶ this example:  $U$  has larger markup,  $D$  larger markdown [Details](#)
- ▶ same profits and welfare impact of mergers.

Similar examples with welfare impact of mergers.

# Are network effects important?

A widespread assumption:

- ▶ firms don't take network position into account;

(Grassi (2019), Baqaee (2018), ...)

To see the implications assume:

- ▶ firms best respond **taking as given prices of other markets.**

Formal definition

Key change: neglect **pass-through** effect:

- ▶ **residual demand** (and supply) **less steep.** Intuition

# Global vs Local

## Theorem

*Assume the set of active links is the same in the standard and in the local S&D equilibrium. If there is a **unique final good**, in the maximal equilibrium under **local** competition, the price of the final good is **smaller** than under global competition.*

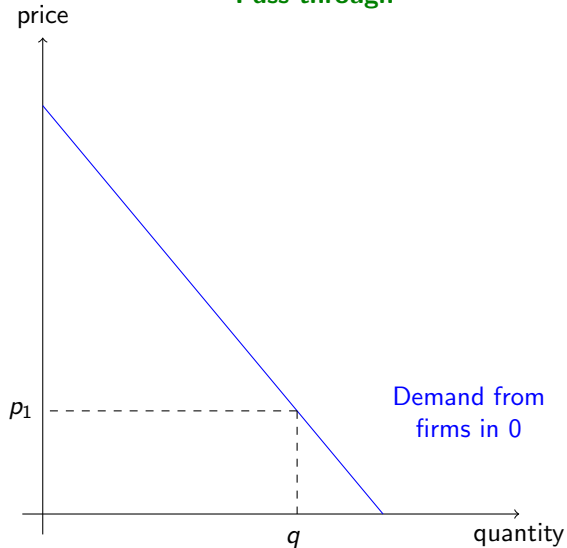
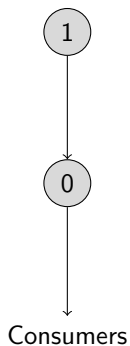
Proof: for given  $(B_j)$ :  $BR_i^{global}(B_{-i}) > BR_i^{local}(B_{-i})$  in p.s.d. sense. [Details](#)

If network is a **line** or a **regular tree**:

- ▶ the welfare is **larger** in the **local** S&D equilibrium.

# Pass-through - Intuition

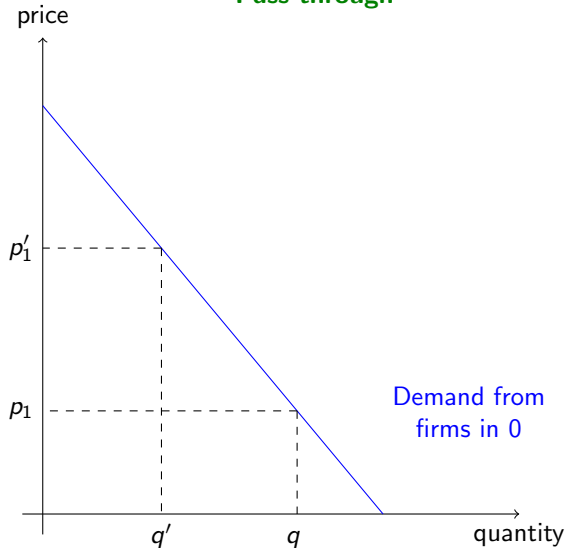
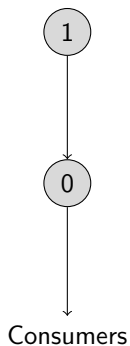
Pass-through





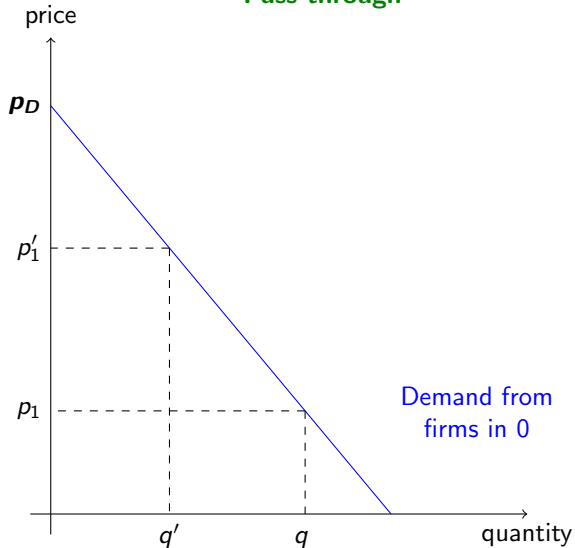
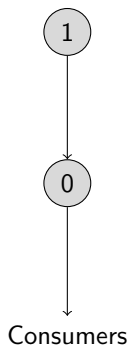
# Pass-through - Intuition

Pass-through



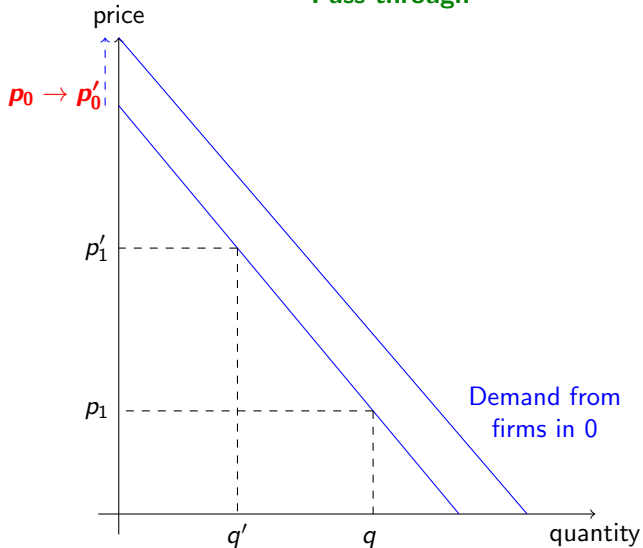
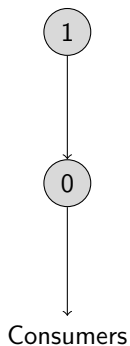
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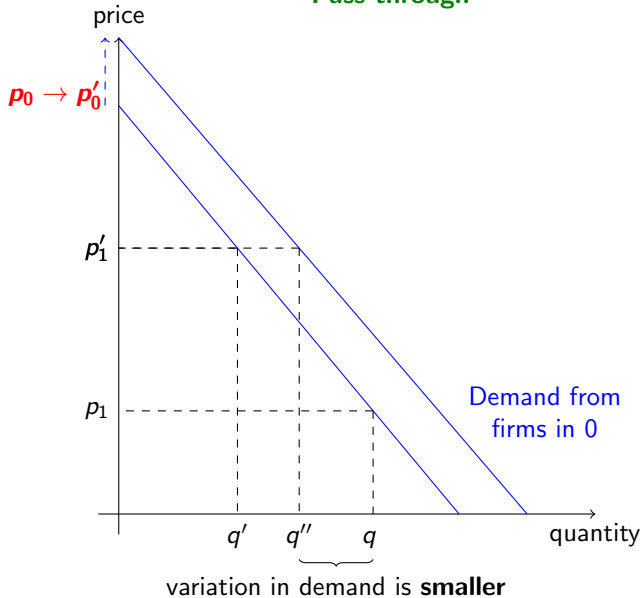
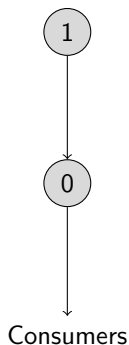
# Pass-through - Intuition

Pass-through



# Pass-through - Intuition

Pass-through



## How different are they?

The relative difference can be **arbitrarily large**:

In a line network of length  $N$ , with 2 firms per sector, we can prove that:

$$\lim_{N \rightarrow \infty} \frac{\text{Welfare}^{global}}{\text{Welfare}^{local}} = 0$$

# Numerical solution

## Needed:

- ▶ data on network;
- ▶ specify number of firms, technology and demand parameters.

## Algorithm:

1. Initialize all coefficients  $B_i$  to either:
  - ▶ “perfect competition” matrices  $C_i$  ( $\rightarrow$  maximal equilibrium)
  - ▶  $\underline{c}I$  for  $\underline{c}$  suff. small ( $\rightarrow$  minimal equilibrium)
2. iterate best reply equations Equations
3. at convergence, check that all trades positive:
  - ▶ if not, cancel link and start back from 1.

Feasible: **2-3 mins** on 6-digit US IO network ( $\sim$  400 sectors);

Important: use Matrix inversion lemma to avoid inverting big matrices.

# Conclusion

Key messages:

- ▶ competition in S&D schedules useful to model economywide strategic interaction;
- ▶ **inter**-sector strategic interaction important for **aggregate** market power;
- ▶ firms having power on **all** markets important for **relative** market power;

For the future:

- ▶ proof of concept on real IO network (in progress);
- ▶ corner solutions → a theory of **endogenous** production networks?





# Structure of proof

- a) The best reply to a linear symmetric profile is unique and still **linear**: defines fixed point equation in matrices  $BR(B) = B$ .
- b)  $BR$  increasing in **positive semidefinite ordering**  $\rightarrow$  iteration of best replies converges (though not a lattice!); Equation
- c) If corner solutions, cancel links and find new solution:
  - ▶ Computing best replies can only decrease set of **active links**.
  - ▶ with empty network  $\exists$  non-trivial equilibrium (KM (1989));
  - ▶  $\Rightarrow$  procedure converges.
- d) profile of matrices such that  $B = BR(B) \rightarrow$  profile of functions  $D$ , that generically are linear in neighborhood of  $\varepsilon = 0$ ,  $p = p^*(0)$ .

back

# Technology

The production function of firms in sector  $i$  is:

$$\begin{aligned}\Phi_i((q_{i\alpha,j}, \ell_{i\alpha,j})_j) &= \sum_j \omega_{ij} \min\{\bar{\ell}_{i\alpha,j}(\varepsilon_i), q_{\alpha,j}\} \\ &= \lim_{\substack{\sigma \rightarrow \infty, \\ \rho \rightarrow 0}} \left( \sum_j \omega_{ij} \left( \left( \bar{\ell}_{i,\alpha j}(\varepsilon_i) \right)^{\frac{\rho}{\rho-1}} + q_{\alpha,j}^{\frac{\rho}{\rho-1}} \right)^{\frac{\rho-1}{\rho}} \right)^{\frac{\sigma}{\sigma-1}}\end{aligned}$$

- ▶  $\bar{\ell}_{i\alpha,j}(\varepsilon_i)$  **effective labor** hours allocated to input  $j$ ;
- ▶  $\bar{\ell}_{i\alpha,j}(\varepsilon_i) = -\varepsilon_i + \sqrt{\varepsilon_i^2 + 2\ell_{i\alpha,j}}$ , where  $\varepsilon_i$  “labor productivity shock”;

back

# Technology with non-specific labor

We can include the possibility of non-input-specific labor:

$$\Phi_i((q_{i\alpha,j}, \ell_{i\alpha,j})_j) = \sum_j \omega_{ij} \min\{\bar{\ell}_{i\alpha,j}(\varepsilon_i), q_{\alpha,j}\} + \omega_i^\ell \sqrt{\ell_i}$$

- ▶ important in case of corner solutions (existence theorem);
- ▶ expressions slightly different, but all results go through; in the presentation I set  $\omega_i^\ell = 0$ .

back

# Technology with general substitution pattern

$$\Phi_i((q_{i\alpha,j}, \ell_{i\alpha,j})_j) = \sum_j \omega_{ij} \min\{\bar{\ell}_{i\alpha,j}(\varepsilon_i), q_{\alpha,j}\} + s \sum_{j \neq k} q_{i\alpha,j} \sum q_{i\alpha,k}$$

- ▶ main case  $s = 0$ ;
- ▶  $s > 0 \rightarrow$  substitutes;
- ▶  $s < 0 \rightarrow$  complements.

back

## General networks - technology

- ▶ each **link** is a market: customized output price (Dhyne et al. (WP))

The **production possibility set** of all  $(q_{ki})_k, (q_{ij})_j, (\ell_{i,kj})_{k,j}$  such that:

$$q_{ki} = \sum_j \omega_{ij} \min\{-\varepsilon_i + \sqrt{\varepsilon_i^2 + 2\ell_{i,kj}}, z_{i,kj}\} \quad k = 1, \dots, d_i^{out}$$

for some subdivision  $(z_{i,kj})$  such that:  $q_{ij} = \sum_k z_{i,kj}$ .

# Intuition

You produce laptops and tablets using  $q_1 =$  hardware and  $q_2 =$  software.  
Set  $\varepsilon_j = 0$ .

You need some number of workers  $l_1$  to deal with hardware, and some others  $l_2$  to deal with software.

You need to allocate both inputs to both production lines, as long as a suitable number of labor hours:

$$q_1 = z_{11} + z_{21} \quad q_2 = z_{12} + z_{22}$$

laptops:  $z_{11} + z_{12}$ , if at least  $\frac{1}{2}z_{11}^2$  and  $\frac{1}{2}z_{12}^2$  units of specific labor

tablets:  $z_{21} + z_{22}$ , if at least  $\frac{1}{2}z_{21}^2$  and  $\frac{1}{2}z_{22}^2$  units of specific labor

Formally, the derivative matrix (Jacobian):

$$J_{i\alpha} = D_{i,p_i^{out},-p_i^{in}}(S_{i\alpha} D_{i,\alpha})_{i\alpha}$$

must be:

- ▶ positive semidefinite of rank at least  $d_i - 1$ ;
- ▶  $\|J_{i\alpha}\| \geq k > 0$

for any  $i, \alpha$ .

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## Best reply equations with Cobb Douglas technology

One output, for simplicity. Shock still additive.

Suppose residual demand and supply are:

$$D_i^r = (p_i^{out})^{\eta_{D,out}} \prod p_{ij}^{-\eta_{D,h}}$$

$$S_{ij}^r = (p_i^{out})^{-\eta_{S,out}} \prod p_{ij}^{\eta_{S,j}}$$

then the best response of  $i$  solves:

$$D_{ih} = \frac{D_i^r}{p_{ih}} \left( \left( 1 - \frac{\lambda_i}{p_i^{out}} \right) \eta_{D,h} - \sum_j \left( \frac{p_{ij} S_{ij}^r}{p_i^{out} D_i^r} - \omega_{ij} \frac{\lambda_i S}{p_i^{out} D^r} \right) \eta_{S,j} \right)$$

$$S_i = - \frac{D_i^r}{p_i^{out}} \left( \left( 1 - \frac{\lambda_i}{p_i^{out}} \right) \eta_{D,out} - \sum_j \left( \frac{p_{ij} S_{ij}^r}{p_i^{out} D_i^r} - \omega_{ij} \frac{\lambda_i S_i}{p_i^{out} D^r} \right) \eta_{S,out} \right)$$

$$S_i = \prod D_{ij}^{\omega_{ij}} \quad (\text{technology})$$

Not analytical anymore (due to  $\lambda_i$ ), and moreover **not Cobb Douglas!**



# Active/inactive links

Linear schedules are:

- ▶ they are identically zero for some links  $E_{i,0} \subset E$  - **inactive links**
- ▶ for the **active links** ( $\notin E_{i,0}$ ),  $\exists$  a matrix  $B_i$  and a vector  $B_{i,\varepsilon}$  s.t.:

$$D_i = B_i \begin{pmatrix} \vdots \\ \omega_{ij} p_i - p_j \\ \vdots \end{pmatrix} + \varepsilon_i B_{i,\varepsilon} \quad B_i \text{ symmetric positive definite}$$

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## Price impacts-line

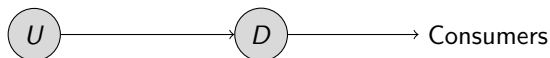
$$\Lambda_0 = \begin{pmatrix} \Lambda_0^{out} & 0 \\ 0 & \Lambda_0^{out} \end{pmatrix} = \begin{pmatrix} B_c & 0 \\ 0 & \left(\frac{1}{n_1 B_1} + \frac{1}{n_2 B_2}\right)^{-1} \end{pmatrix}$$

$$\Lambda_1 = \begin{pmatrix} \Lambda_1^{out} & 0 \\ 0 & \Lambda_1^{out} \end{pmatrix} = \begin{pmatrix} \left(\frac{1}{B_c} + \frac{1}{n_0 B_0}\right)^{-1} & 0 \\ 0 & n_2 B_2 \end{pmatrix}$$

$$\Lambda_2 = \left(\frac{1}{B_c} + \frac{1}{n_1 B_1} + \frac{1}{n_0 B_0}\right)^{-1}$$

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# Markups and markdowns



Rewrite best reply problem as:

$$\max_{p^{out}, p^{in}, z} D^r p^{out} - p^{in} S^r - C(z)$$

subject to:

$$(\lambda) \quad D^r = z \quad \lambda : \text{marginal value of output}$$

$$(\mu) \quad S^r = z \quad \mu : \text{marginal value of input}$$

FOCs:

$$\text{markup: } M = \frac{p^{out} - \lambda}{p^{out}} = -\frac{D^r}{p^{out}(D^r)'} \quad (1)$$

$$\text{markdown: } m = \frac{\mu - p^{in}}{p^{in}} = \frac{S}{p^{in}(S^r)'} \quad (2)$$

In S&D equilibrium:

- ▶  $U$  has larger **markup**;
- ▶  $D$  has larger **markdown**.

## Why markup increasing upstream

Inverse demand of sector 0:  $p_0(Q_0)$

First order conditions in market 1 give inverse demand:

$$p_1 = \left( p'_0 \frac{Q_1}{n} + p_0 \frac{Q_1}{n} \right) - \frac{Q_1}{n}$$

The markup of firms in sector 1 are then:

$$\begin{aligned} \mu_1 = \eta_{p_1} &= - \left( \frac{p'_0 \frac{Q_1}{n}}{p'_0 \frac{Q_1}{n} + p_0 - \frac{Q_1}{n}} (\eta_{p'_0} + 1) + \frac{p_0}{p'_0 \frac{Q_1}{n} + p_0 - \frac{Q_1}{n}} \eta_{p_0} \right) \\ &= \underbrace{\frac{-p'_0 \frac{Q_1}{n}}{p'_0 \frac{Q_1}{n} + p_0 - \frac{Q_1}{n}}}_{>0} \underbrace{(\eta_{p'_0} + 1)}_{>0} + \underbrace{\frac{p_0}{p'_0 \frac{Q_1}{n} + p_0 - \frac{Q_1}{n}}}_{>1} \mu_0 > \mu_0 \end{aligned}$$

## Price impact in terms of the network

In a tree  $M$  can be written as  $D^{1/2}(I - L)D^{1/2}$ , where:

- ▶  $L$  is the (weighted) **adjacency matrix** of the **line graph**: is indexed by **links** and has a 0 where **links do not share a node**.

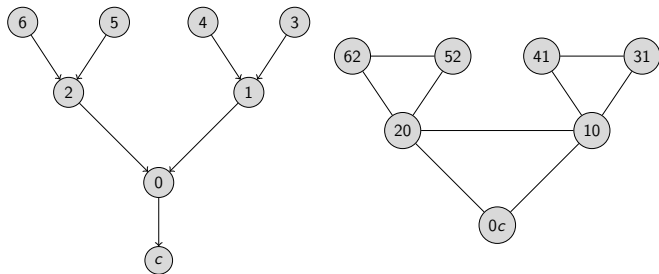


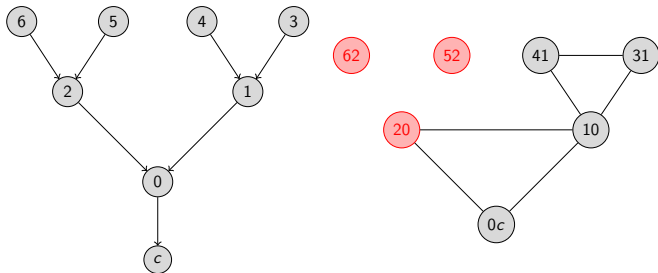
Figure: Right: the line graph of the tree on the Left.

In a tree  $M^{-1}$  is the analogous of a **bilateral Leontief inverse**:

- ▶ in equilibrium  $M^{-1} = D^{-1/2}(I - L)^{-1}D^{-1/2}$ .
- ▶ entry  $i,j$  of  $M^{-1}$  measures the **number of links** between  $i$  and  $j$  (properly normalized and weighted)

Moreover, price impact matrix  $\Lambda_i$  is **diagonal**, and:

- ▶ consider **reduced** line graph (cancel links corresponding to sector  $i$ );
- ▶ price impact on input  $j \rightarrow$  **number of self-loops** of  $(i,j)$  in the **reduced** line graph.



## Nash bargaining

Methodology adapted and simplified from Acemoglu and Tahbaz-Salehi (WP):

- ▶ upstream firm  $U$  and downstream  $D$ ;
- ▶ fixed labor supply:  $L = 1$ ;
- ▶ linear technology:  $\Phi_i(q_i) = q_i$
- ▶ prices determined by **Nash products** on each link:

$$\max_{p_U} \pi_D(p_D, p_U)^{1-\delta} \pi_U^\delta(p_U)$$

The surplus is split according to:

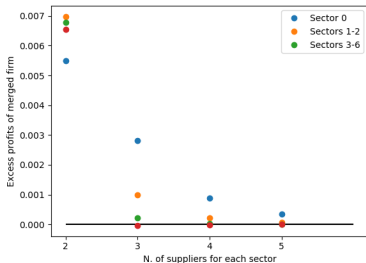
$$\begin{aligned} \delta(p_0 - p_1) &= (1 - \delta)p_1 \\ A_c - B_c p_0 &= 1 \end{aligned}$$

so  $D$  has larger **markups** and **profits** if and only if  $\delta < \frac{1}{2}$ .

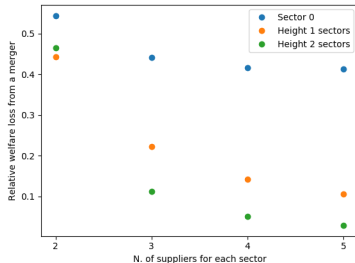
Choice of  $\delta$  is imposing relative market power structure.

# Impact of mergers - Trees

- ▶ profitability of mergers is larger at the root (Left);
- ▶ welfare impact of mergers is too (Right).



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## Horizontal mergers are harmful - Idea of proof

Best reply (slope) (p.s.d-)increasing in  $n_i$ :

$$BR_i(B_{-i}, n_i) \geq BR_i(B_{-i}, n_i - 1)$$

Max fixed point pre-merger  $B^*$ , after merger  $B_m^*$ .

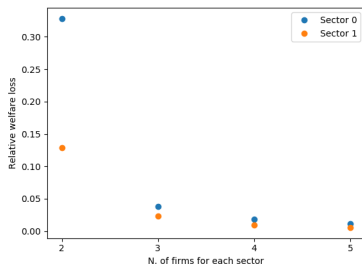
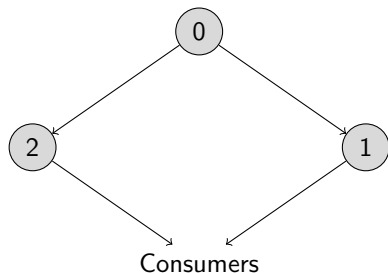
$$B_m^* = BR(B_m^*, n_i - 1) \leq BR(B_m^*, n_i)$$

Now iterating  $BR(\cdot, n_i)$  we get an increasing sequence, that converges to an equilibrium  $D^* \leq B^*$ .

Hence  $B_m^* \leq B^*$ .

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# Revenues are not sufficient statistics



In the network above assume  $\omega_{10} = \omega_{20} = \omega_0 = 2$ , then:

- ▶ all sectors have the **same revenues**;
- ▶ mergers in sector 0 have a much larger impact.

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## Local S&D Equilibrium

Formally: the game  $\mathcal{G}$  remains identical, but now

- ▶ firm  $\alpha$  in sector  $i$ , when optimizing, takes prices of *other* sectors  $p_{-i}$  as given.

That is, in computing payoffs, solve the market clearing conditions **only** for  $p_i, p_i^{in}$ :

$$\text{for links } (k \rightarrow i) \quad \sum_{\beta} D_{i\beta,k}(p_i, p_i^{in}, \varepsilon_j) = \sum_{\alpha} S_{k\alpha}(p_k, p_k^{in}, \varepsilon_k)$$

$$\text{for links } (i \rightarrow j) \quad \sum_{\beta} D_{j\beta,i}(p_j, p_j^{in}, \varepsilon_j) = \sum_{\alpha} S_{i\alpha}(p_i, p_i^{in}, \varepsilon_i)$$

finding  $p_i^L(\varepsilon, p_{-i})$ ,  $(p^L)_i^{in}(\varepsilon, p_{-i})$  and then

$$\pi_{i\alpha}^L = \mathbb{E} \left( p_i^L S_{i\alpha} - \sum_j p_j^L D_{i\alpha,j} - \sum_j \ell_{i\alpha,j} \right)$$

Definition of symmetric linear equilibrium remains the same.

## Global vs Local - Idea of proof

The market clearing system coefficient matrix can be written:

$$M = \begin{pmatrix} M_i & S_i \\ S_i' & M_{-i} \end{pmatrix} \quad \text{and is p.d.}$$

Residual demand coefficients:

- ▶ under local competition:  $\Lambda_i^{local} = M_i$
- ▶ under global competition:  $\Lambda_i^{global} = M_i - S_i' M_{-i}^{-1} S_i \leq M_i$

Hence  $BR_i^{global}(B_{-i}) \leq BR_i^{local}(B_{-i})$ , then use strategic complementarity.

## Matrix Inversion Lemma - Woodbury Identity

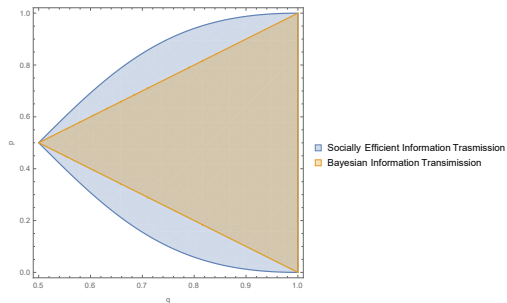
Suppose  $A$  is  $n \times n$ ,  $U$  is  $n \times k$ ,  $V$  is  $k \times n$ , and  $k \ll n$ . Then:

$$(A + UV)^{-1} = A^{-1} - A^{-1}U(I_k + VA^{-1}U)^{-1}VA^{-1}$$

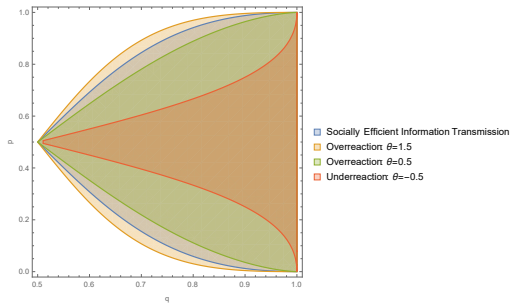
and in particular, to compute the correction is sufficient to invert the  $k \times k$  matrix  $I_k + VA^{-1}U$ .

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# Efficient information transmission as a function of parameters

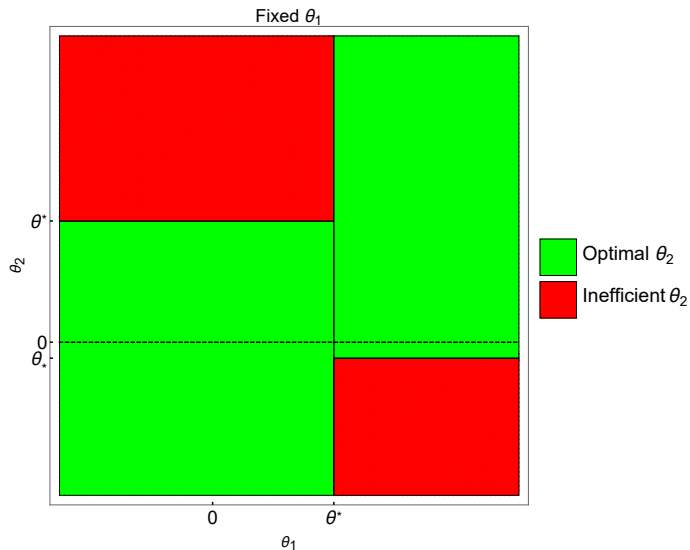


# Efficient information transmission as a function of parameters



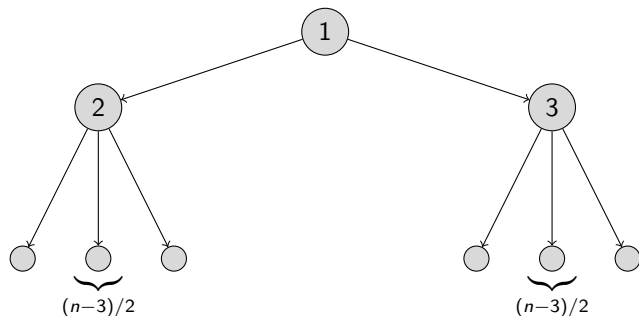
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# Fix $\theta_1$ : when does Mr.2 benefit from Mr.1? A numerical example





## Example



$\beta$  means consumers discount more heavily **longer paths**:

- ▶ in static model consumer prefers a negative shock to 2;
- ▶ in dynamic model prefers shock to 1.

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## Why smaller volatility?

Let's look at expression for covariances in the static model:

$$\text{Cov}_{stat}(y_i, y_j) = \sum_k \sigma_k^2 m_{ki} m_{kj}$$

this is high when:

- ▶ there are nodes  $k$  such that there are many paths from  $k$  to both  $i$  and  $j$ ;
- ▶ since  $\sum_k m_{ki}=1$ , to be very high must be that these nodes are few (asymmetric contribution) and have high volatility.

and dynamic model:

$$\text{Cov}_{dyn}(i, j) = \sum_n \alpha^{2n} \sum_k \sigma_k g_{ki}^{(n)} g_{kj}^{(n)}$$

similar to above, but

- ▶ now only paths from  $k$  to  $i$  and  $j$  of **same length** matter.
- ▶ covariance always smaller.