### **Endogenous Production Networks**

Daron Acemoglu & Pablo Azar (Ecta., 2020)

Antonio Martner Networks and innovation reading group with Professor Hopenhayn UCLA, Feb 17th, 2023

### Motivation

#### **Questions:**

- (a) What explains the different structures of firm input usage over time?
- (b) Do these differences contribute to productivity and growth differences?

#### What this paper does:

- (a) Build an endogenous production networks model focusing on firms using new inputs, cheaper inputs, or new technologies.
- (b) Extend the model to a dynamic version to study TFP growth implications of endogenous production network formations.
- (c) Applied exercise on industry TFP growth due to new input combinations.

**Key takeaway :** Changes to the input-output structure of the economy might have economic growth implications.

### Static Model: Setup

### **Production technology:** $Y_i = F_i(S_i, A_i(S_i), L_i, X_i)$

i: industry,  $S_i$ : endogenous supplier set,  $X_i$ :intermediate inputs

A1: F has CRS in (L, X), increasing in A. Labor is essential F(...L = 0...) = 0

#### Cost minimization problem:

$$K_i(S_i, A(S_i), P) = \underset{X_i, L_i}{\textit{Min}} L_i + \sum_j P_j X_{ij} \text{ s.t. } F_i(S_i, A_i(S_i), L_i, X_i) = 1$$

 $\mu$ : distortion: markup, taxes, regulations, finance market imperfections  $P_i^* = (1 + \mu_i)K_i^*(S_i^*, A(S_i^*), P^*)$ 

### Household preferences: $u(C_1, ..., C_n)$

A2: continuous, differentiable, increasing, quasiconcave, all goods normal

#### Equilibrium:

(1) Contestability. (2) Consumer Max. (3) Cost Min (4) Market clearing.

# Static Model: CD production function

$$F_{i} = \frac{1}{\left(1 - \sum_{j \in S_{i}} \alpha_{ij}\right)^{1 - \sum_{j \in S_{i}} \alpha_{ij}} \prod_{j \in S_{i}} A_{i}\left(S_{i}\right) L_{i}^{1 - \sum_{j \in S_{i}} \alpha_{ij}} \prod_{j \in S_{i}} X_{ij}^{\alpha_{ij}}} K_{i} = \frac{1}{A_{i}\left(S_{i}\right)} \prod_{j \in S_{i}} P_{j}^{\alpha_{ij}}$$

Firms choose a set of suppliers by balancing the tradeoff between high productivity and low prices.

# Static Model: Equilibrium charecterization

- Existence
- Uniqueness
- Efficiency: 4 possible cases, including a realistic one with heterogenous distortions  $(\mu_i \neq \mu_j)$  where Pareto efficiency is not achieved.

### Other key assumptions

- (a) Each industry is contestable (i.e., all firms have access to the same production technology and can enter without barriers)
- (b) The production function does not depend on specific intermediate inputs  $(X_i)$ ; combining a richer set of inputs, an industry can reach higher productivity.
- (c) Adopting/dropping new suppliers is costless.

# Static Model: Comparative Statics

#### Three main results:

- (a)  $\Delta^+ A_i(S_i)$  or  $\Delta^- \mu \implies \Delta^- P$ .
- (b)  $\Delta^+ A_i(S_i) \implies \text{Network expansion}$ .
- (c) Discontinuous effects; small changes in parameters  $\implies$  large GDP effects.

#### Two complementary channels:

- Direct effect:  $A_i(S_i)$  increases  $\implies$  industry i reduce its unit costs (K).
- Indirect effect:  $\Delta^+ A_i(S_i) \implies \Delta^- P_j \implies \Delta^- K_j$  $\implies$  buyers of industry j will face lower prices too, and so on.

# Static Model: Comparative Statics key assumption

### **Technology-Price Single-Crossing Condition**

$$K_{i}\left(S_{i}^{\prime},A_{i}\left(S_{i}^{\prime}\right),P\right)-K_{i}\left(S_{i},A_{i}\left(S_{i}\right),P\right)\leq0$$

$$\implies K_{i}\left(S_{i}^{\prime},A_{i}\left(S_{i}^{\prime}\right),P^{\prime}\right)-K_{i}\left(S_{i},A_{i}\left(S_{i}\right),P^{\prime}\right)\leq0$$

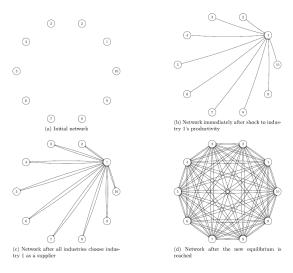
Facing lower prices, other industries will also be induced to (weakly) expand their sets of suppliers.

$$\Delta^+ A_i(S_i) \implies$$

- (a)  $\Delta^+$  Productivity level of different input combinations.
- (b) Increase in the marginal return from adopting additional input combinations.
- (c) Additional inputs do not directly reduce the productivity from adopting yet further inputs.

### Static Model: Discontinuous effect example

Figure:  $\Delta^+ A_1$ ; 1 use all industries as inputs;  $\Delta^- P_1$ ; all industries buy from 1



### Dynamic Model

**Goal:** Show how a new economic force productivity growth (from new input combinations) to generate sustained economic growth

**Technology set:** t products in the economy, then each industry i has access to t-1 possible suppliers and  $2^{t-1}$  ways of combining these suppliers.

**Dynamics:** One new industry arrives in each period, and all firms can update their technology by combining the new industry's product with any other subset of products.

# Dynamic Model: New features

Household preferences:

$$u(C_1(t),\ldots,C_t(t),\beta) = \left[\prod_{i=1}^t \left(\frac{\beta_i}{\sum_{i=1}^t \beta_i}\right)^{-\beta_i} \prod_{i=1}^t C_i(t)^{\beta_i}\right]^{\frac{1}{\sum_{i=1}^t \beta_i}}$$

- Real GDP:  $Y(t) = \frac{Y^N(t)}{\prod_{i=1}^t P_i(t)^{\frac{\beta_i}{\sum_{i=1}^t \beta_j}}}$
- Price index:  $\pi(t) = -\beta(t)'\mathcal{L}(t)a(S(t) m(t))$  $\beta$  consumption shares vector, a log productivity vector,  $\mathcal{L}$  Leontief Inverse, m distortions vector.

A4: log productivity distributions cannot have either too thin or too thick tails. (ie. Gumbel or exponential distributions)

Implicit A.: All new inputs can be used on industry *i* technology. New inputs may not just reduce costs but also transform a product's use in consumption or as an input significantly, transforming it into a new good.

# Dynamic Model: Sustained growth

**Key Result** When firms can select their set of suppliers from all available combinations, the economy will achieve sustained economic growth. Each industry chooses the cost-minimizing combination.

#### Two channels:

- Direct effect: Each industry *i* faces an expanded set of possible input combinations, its cost, and thus equilibrium price declines.
- Indirect effect:  $\Delta^- P_i$ , industries that use industry i output as input will also benefit because their costs will decrease.

# Dynamic Model: Dealing with unrealistic assumptions

With small changes to assumptions, the model can deal with two caveats.

- Certain input classes may be essential for the production of some types of goods (i.e., copper for cables)
- It does not allow for new inputs or new input combinations, to replace old ones. Not creative destruction.

# Cross-sectional implications: Static economy with large n

**Productivity:**  $a_i(S_i) = \sum j \in S_i b_j + \epsilon(S_i)$ .

The productivity of a set of inputs depends on the average productivity of the inputs as well as a random term drawn from a Gumbel distribution.

#### Main result:

The distribution of outdegrees (industry i sales to other industries, O(n)) will be much more unequal than the distribution of indegrees (industry i purchases to other sectors, I(n)). Wich matches the US (and Chilean) data

# New input combinations boost productivity growth (1)

**Data:** TFP and input-output tables for 452 manufacturing industries and 36 nonmanufacturing industry for the years 1987, 1992, 1997, 2002, and 2007, from NBER-CES and BEA.

### Jaccard distance of sets of suppliers between t and t-1:

$$J_i(t) = \frac{|S_i(t) \cup S_i(t-1)| - |S_i(t) \cap S_i(t-1)|}{|S_i(t) \cup S_i(t-1)|}$$

 $J_{i,20}(t)$ : Dummy for this measure being above the 20th percentile of its distributionis; proxy for significant change in input structure

#### Reduced form model:

$$\Delta a_i(t) = \gamma \Delta J_{i,20}(t) + \nu_i + \eta(t) + \epsilon_i(t)$$

 $\Delta a_i(t)$ : five-year change in (log) TFP;  $\eta(t)$  denotes a full set of time effects,  $\epsilon_i(t)$  denotes a full set of industry dummies

# New input combinations boost productivity growth (2)

	(1)	(2)	(3)
Panel A: All Indu	stries (1987–2	2007)	
$J_{i,20}$	0.018	0.020	0.047
	(0.007)	(0.010)	(0.014)
Counterfactual TFP change	0.42%	0.48%	1.12%
Panel B: Manufac	turing (1987–	2007)	
$J_{i,20}$	0.018	0.021	0.047
-,	(0.008)	(0.011)	(0.016)
Counterfactual TFP change	0.42%	0.49%	1.14%
Panel C: All Industries Exclu	iding Comput	ers (1987–200	7)
$J_{i,20}$	0.011	0.011	0.033
	(0.006)	(0.009)	(0.014)
Counterfactual TFP change	0.25%	0.25%	0.78%
Linear industry trends	No	Yes	Yes
Control for lagged change in TFP	No	No	Yes

 $\implies$  Without the productivity gains from new input combinations, average productivity growth would have been lower by 0.42 percentage points (40%) relative to the annualized average industry TFP growth of 1.05%

# New input combinations boost productivity growth (3)

Productivity gains from new input combinations could be quite large! But the results are just illustrative:

- (a) Results rely on the structure of the model, which is simplified in many dimensions.
- (b) Estimates may be upwardly biased and thus exaggerate the contribution of new input combinations to productivity because of omitted variables. (e.g., exogenous innovations may encourage the use of new inputs)

# Wrapping up: Static model

- (a) When a product adopts new inputs to minimize its costs, this not only reduces its price but (weakly) reduces all prices in the economy.
- (b) A change in technology that makes the adoption of additional inputs more productive for one industry—or a reduction in distortions in one industry—expands technology sets for all industries.
- (c) Technology changes are potentially discontinuous; a small change in one industry can cause large changes in GDP or trigger a chain reaction, leading to major shifts in the production structure of many industries.

# Wrapping up: Dynamic model

- (a) When a new product arrives, it becomes a potential input for all existing products and significantly expands the number of input combinations (production techniques) available to other industries.
- (b) With n products, the arrival of one more new product increases the combinations of inputs that each existing product can use from  $2^{n-1}$  to  $2^n$ , thus enabling nontrivial cost reductions from the choice of optimal technology combinations.
- (c) A new production technique reduces the price of the relevant product, encouraging other industries to adopt this product as an additional input and change their production techniques.

### Personal comments

The paper proposes a brilliant structure to analyze how the change in production networks can shape economic growth.

#### Room for future research:

- The model allows for makups, but assumes  $\pi = 0$ , and does not allow for buyer market power (markdows).
- No bargaining process modeling and no bargaining power at all.
- The model is built at the industry level; not that difficult to extend it to the firm level and exploit within industry variation.
- Industry-level data might hide lots of heterogeneity and extensive/intensive margin of inputs. Firm-level data might shed light on the performance of the model.