# Discussion of "Firm-to-Firm Trade in Sticky Production Networks" by Kevin Lim

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RIETI Workshop "Dynamics of Inter-Firm Network and Macro Fluctuation"

February 26, 2018

## Summary of the Paper

- ► Theory of endogenous network formation between firms
- Combination of random chance and strategic choice
- Main contribution of the theory:
  - Tractability
  - Produces the key fact from the data that larger firms are connected to more buyers and suppliers than smaller firms
- Takeaways from the empirical/quantitative part:
  - ► Both relationship heterogeneity and endogeneous network structure are quantitatively important

## Key Features of the Static Environment Overview

- Fixed number of firms: no entry and exit
- Production technology: CES combination of labor and varieties of other firms
- Every firm sells to and buys from every other firm
  - My interpretation (maybe, not correct)
- ▶ All firms sell their good to the household
- Market structure: monopolistic competition both on the firm-to-firm and firm-to-household markets

## Key Features of the Static Environment

#### Firms and Network

- Firms characterized by fundamental productivity and demand,  $\phi$  and  $\delta$ 
  - Higher  $\phi \Longrightarrow$  more efficient in using labor input
  - Higher  $\delta \Longrightarrow$  household buys more
- ▶ **Continuum** of firms of each type  $\chi \equiv (\phi, \delta)$
- $m\left(\chi,\chi'\right)$  is a chance that type  $\chi$  meets type  $\chi'$
- ▶ Since there is a continuum of firms  $\chi$ ,  $m(\chi, \chi')$  is
  - Fraction of firms  $\chi'$  that sell to type  $\chi$
  - Fraction of firms  $\chi$  that buy from firm  $\chi'$
- ▶ Identities of connected firms within types  $\chi$  and  $\chi'$  are not important
  - Probablistic characterization similar to Eaton-Kortum

## Key Features of the Static Environment

Firms and Network

#### My interpretation:

- lacktriangle Every firm  $\chi$  is connected with every other firm  $\chi'$
- "Intensity" of connection is given by  $m(\chi, \chi')$
- ▶ Without this, need to solve a large discrete choice problem

## Static Equilibrium

- Network structure translates fundamental productivity  $\phi$  and demand  $\delta$  into network productivity  $\Phi$  and demand  $\Delta$
- ▶ Given function  $m\left(\chi,\chi'\right)$ , functions  $\Phi\left(\chi\right)$  and  $\Delta\left(\chi\right)$  completely characterize static equilibrium

## Key Features of the Dynamic Environment

- Cost  $f_t = \psi \xi_t$  of maintaining a link between any two firms
  - Payed by seller in terms of labor
  - $\xi_t$  has distribution  $G_{\xi}$  and unit mean
  - ▶ Now network is parametrized by distribution of  $(\chi, \chi', \xi_t)$
- $\blacktriangleright$  Seller is given opportunity to alter link with a buyer with probability  $(1-\nu)$ 
  - Establish link if are not connected
  - Remove link if connected
- Given opportunity to alter link, seller makes an optimal forward-looking decision
  - ► The only intertemporal decision in the model
- ► Combination of chance  $(1 \nu)$  and optimal choice determine evolution of links between firms of types  $\chi$  and  $\chi'$ ,  $m_t(\chi, \chi')$ 
  - ▶ Function  $m_t(\chi, \chi')$  is the state of the network
- ▶ Given  $m_t(\chi, \chi')$ ,  $\Phi_t(\chi)$  and  $\Delta_t(\chi)$  completely characterize equilbrium in period t

## Structural Estimation

▶ Parametric assumptions:

$$\begin{bmatrix} \ln \phi \\ \ln \delta \end{bmatrix} \sim \mathcal{N} \left( \begin{array}{cc} 0 \\ 0 \end{array}, \begin{bmatrix} 0 & v^2 \\ v^2 & 0 \end{bmatrix} \right),$$

and  $\xi_t$  has Weibul distribution with shape  $s_\xi$  and scale  $\lambda$ , i.e.,

$$G_{\xi}(x) = 1 - e^{-\left(\frac{x}{\lambda}\right)^{s_{\xi}}}$$

- Scale  $\lambda$  is such that  $E[\xi_t] = 1$
- ▶ Focus on estimation of v,  $\psi$ ,  $s_{\xi}$ , and  $\nu$ 
  - ▶ Other parameters are assigned plausible values

## Structural Estimation

#### Targeted Moments

- 7 targeted distributions:
  - 1. Revenues
  - 2. Number of suppliers
  - 3. Number of customers
  - 4. Supplier retention rates
  - 5. Customer retention rates
  - 6. Supplier creation rates
  - 7. Customer creation rates
- ▶ Distributions 1-3 "identify" *v*
- ▶ Distributions 4-7 "identify"  $s_{\varepsilon}$  and  $\nu$
- $m{\psi}$  is estimated by matching the labor share devoted to production of varieties equal to 0.7
  - Motivated by the fact that degree count is continuous in the model but discrete in the data
  - Needs a better explanation
- Overall, reasonable fit

### Counterfactual Exercises

- ▶ Firms are divided into 10 groups by their revenue
- Four sets of counterfactual exercises:
  - ▶ Positive/negative shock to productivity  $\phi$  for all firms in decile 1, 2, . . . , 10
  - Positive/negative shock to demand  $\delta$  for all firms in decile 1, 2, ..., 10
- Baseline result:
  - ► The bigger is the size of affected firms, the bigger is the positive/negative effect on welfare

## Counterfactual Exercises

Importance of Structure and Dynamics of Network

- Relationship heterogeneity is quantitatively important
  - Without heterogeneity, welfare effects of small firms are overpredicted and those of large firms are underpredicted
- Propagation of shocks with a fixed network
  - ► First-order effect approximates well the total welfare effect
- ► The role of endogeneity of network
  - Quantitatively important

### Discussion

- ▶ Firm entry and exit is important feature of data
  - Probably, not difficult to incorporate
- Continuum of firms, so shock to any paritcular firm is negligible
  - ► Goes against the "granularity" macro literature

#### Discussion

The exercise with shocks to a fixed network:

- ► The paper calls this exercise "Supply chain heterogeneity"
- Arguably, the model is not fit to speak to supply chain heterogeneity
  - For each firm type  $\chi$ , there is a continuum of firms with the full distribution of supply chain lengths
- ► The small predicted higher-order effects of the shock are counterfactual to what is found in the data by Carvalho, Nirei, Saito, and Tahbaz-Salehi (2016)