

Multinationals Corporations and Productivity

Veronica Rappoport
London School of Economics, CEPR

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Why should we care about MNCs?

- Largest and most innovative firms
- Most of their employment, VA and innovation in source country
- USA 2020 (BEA):
 - ▶ US parents = 23% private employment
 - ▶ US parents = 20% private value added
 - ▶ US parents = 64% business R&D

MNCs shape foreign sales

- U.S. multinationals are large exporters and importers

$$\frac{\text{P total exports}}{\text{U.S. exports}} = 57\%$$

$$\frac{\text{P total imports}}{\text{U.S. imports}} = 35\%$$

- Intra-firm flows are **large** as share of P total trade

$$\frac{\text{Shipments from P to A}}{\text{P total exports}} = 40\%$$

$$\frac{\text{Shipments from A to P}}{\text{P total imports}} = 49\%$$

- Intra-firm flows are **small** relative to A's activity

$$\frac{\text{Shipments from P to A}}{\text{Total A sales}} = 10\%$$

$$\frac{\text{Shipments from A to P}}{\text{Total A sales}} = 9\%$$

- A sales are large relative to U.S. trade

$$\frac{\text{Total A sales}}{\text{U.S. exports}} = 2.3$$

$$\frac{\text{Total A sales}}{\text{U.S. imports}} = 1.9$$

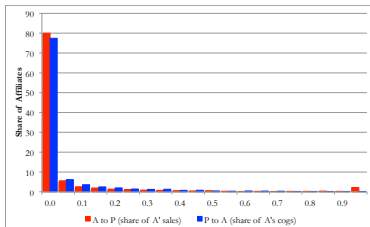
Today: Affiliates as Production Units for Foreign Sales (Horizontal)

- Most Affiliates sale directly to unaffiliated parties

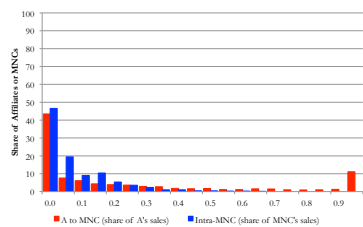
Ramondo, Rappoport & Ruhl (2016)

... but some affiliates sale exclusively inside the MNC

Figure: Distribution of As and MNCs by intra-firm sales



(a) Affiliate-Parent



(b) Intra-MNC trade

How do International Activities affect Productivity?

- Effect of Exports on Innovation
 - ▶ Selection and reallocation effect
Melitz (2003), Pavcnik (2002)
 - ▶ Natural Experiment: Causal effect of change in tariffs on firms' innovation
Bustos (2011), Lileeva & Trefler (2010), Verhoogen (2008)
 - ▶ Complementarities: joint process of R&D, trade and productivity
Costantini & Melitz (2007), Atkenson & Burstein (2008), Aw, Roberts & Xu (2011)
- Do these lessons apply to multinational activities?

Multinationals and Productivity

- Selection into multinational activities
 - ▶ Basic framework: CES demand+ monopolistic competition
Helpman, Melitz & Yeaple (2004)
- MNCs and cross-country productivity
 - ▶ Macro-accounting
Alvarez, Cravino & Ramondo (2020)
- Transmission of technology within the MNC?
 - ▶ Structural IO
Bilir & Morales (2020)
- How does that feed back into MNC's incentives to innovate?
 - ▶ Calibrated model
Goldman, Guadalupe, Rappoport & Roerig (2023)
- Are Affiliates better just because they adopt Parent's technology?
 - ▶ Applied Micro
Guadalupe, Kuzmina & Thomas (2012)

Selection

- Heterogeneous firms and fixed/entry cost

Melitz (2003), Helpman et al. (2004),...

- ▶ Cost structure: fixed/sunk and variable costs: $C(q, \varphi) = f + q \frac{w}{\varphi}$
- ▶ Monopolistic competition and CES demand with elasticity σ

$$p(\varphi)q(\varphi) = \underbrace{(PQ)}_Y \underbrace{\left(\frac{P}{p(\varphi)}\right)^{\sigma-1}}_{\text{mkt share}} \quad p_j(\varphi) = \frac{\sigma}{\sigma-1} \frac{w_n}{\varphi_j} \quad j \in \{d, x, f\}$$

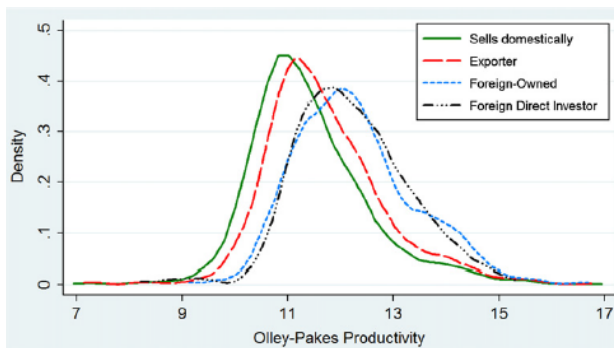
- ▶ Profit maximization

$$\begin{aligned} \varphi_d = \varphi & : \pi^d(\varphi) = \frac{(1-\sigma)^{1-\sigma}}{\sigma} \varphi^{\sigma-1} \left(\frac{P}{w}\right)^{\sigma-1} Y - f \\ \varphi_x = \varphi \cdot \tau_x^{-1} & : \pi^x(\varphi) = \frac{(1-\sigma)^{1-\sigma}}{\sigma} \varphi^{\sigma-1} \left[\left(\frac{P}{w}\right)^{\sigma-1} Y + \tau_x^{1-\sigma} \left(\frac{P^*}{w}\right)^{\sigma-1} Y^* \right] - f - f_x \\ \varphi_f = \varphi \cdot \kappa_f^{-1} & : \pi^m(\varphi) = \frac{(1-\sigma)^{1-\sigma}}{\sigma} \varphi^{\sigma-1} \left[\left(\frac{P}{w}\right)^{\sigma-1} Y + \kappa_f^{1-\sigma} \left(\frac{P^*}{w^*}\right)^{\sigma-1} Y^* \right] - f - f_m \end{aligned}$$

- Positive Cross-Derivative (Supermodularity): $\frac{\partial^2 \pi(Y, \varphi)}{\partial \varphi \partial Y} > 0$

Selection into International Activities

- Variable vs. Fixed/Sunk cost: proximity-concentration trade off



Source: Antras & Yeaple (2014) - Spanish firms

- Still to answer:
 - ▶ Is it true that Parent productivity is transferred to foreign Affiliates?
 - ▶ How does FDI affect productivity in host countries?
 - ▶ Do best firms become MNCs and/or MNC makes them better?

**MNCs
and
Cross-Country Productivity**

MNCs and cross-country productivity

- A macro-accounting approach: Alviarez, Cravino & Ramondo (2020)

- ▶ Productivity of MNC from s in n : $\varphi_{s,n} = Z_n \varphi \kappa_{s,n}^{-1}$

$$y_{s,n}(\varphi) = Y_n \underbrace{\left(\frac{P_n}{p_{s,n}(\varphi)} \right)^{\sigma-1}}_{\text{mkt share}} \quad p_{s,n}(\varphi) = \frac{\sigma}{\sigma-1} \frac{w_n}{Z_n} \frac{\kappa_{s,n}}{\varphi}$$

- ▶ No-trade in intermediates. All n -output is produced in n

$$P_n = \frac{\sigma}{\sigma-1} \frac{w_n}{Z_n} \underbrace{\left[\sum_s \int_{\varphi \in M_{s,n}} \varphi_{s,n}^{\sigma-1} d\varphi \right]^{\frac{1}{\sigma-1}}}_{\Phi_n}$$

- ▶ Productivity from market shares of MNCs across countries:

$$\text{MarketShare}_{s,n}(\varphi) = \left(\frac{\varphi}{\kappa_{s,n} \Phi_n} \right)^{\sigma-1}$$

MNCs and cross-country productivity

- Data:
 - ▶ MNCs: Ultimate parent, revenues by location-industry of affiliate (Orbis)
 - ▶ Macro: Revenues by country-industry (Klems) and IncomePW (PennTables)
- Recovering country's firm-embedded productivity from market shares

$$\begin{aligned}\log MktShare_{s,n}(\varphi) &= (\sigma - 1)(\log \varphi - \log \kappa_{s,n} - \log \Phi_n) \\ &= FE_i - [\beta_l lang_{s,n} + \beta_d dist_{s,n}] - \tilde{\Phi}_n\end{aligned}$$

- What is aggregate TFP?

$$\frac{Y_n}{L_n} = Z_n \times \Phi_n$$

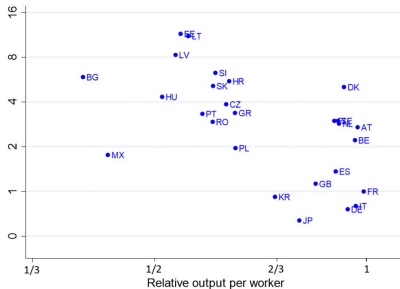
Z_n Country- n 's general productivity: institutions? markets? (residual)

Φ_n Country- n 's firm-embedded productivity

MNCs and cross-country productivity

- Intuition:
 - ▶ MNCs productivity similar across countries
 - ▶ But countries have very different domestic-firm productivities
 - MNCs have larger mkt share in countries with low firm-productivity Φ

Figure: MNCs Market Shares



Note: output per worker and market shares, expressed relative to France

MNCs and cross-country productivity

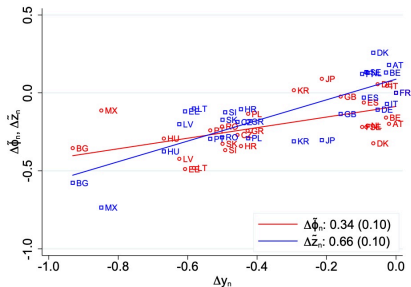


Figure: TFP Decomposition

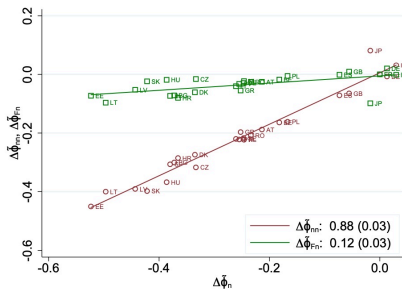


Figure: Φ Decomposition

$$\frac{Y_n}{L_n} = Z_n \times \Phi_n$$

$$\Delta y_n = \Delta z_n + \Delta \phi_n$$

$$\Delta \phi_n \approx \underbrace{MS_{nn} \Delta \phi_{nn}}_{\Delta \tilde{\phi}_{nn}} + \underbrace{(1 - MS_{nn}) \Delta \phi_{Fn}}_{\Delta \tilde{\phi}_{Fn}}$$

domestic firms *MNCs*

Beyond macro-accounting...

- Cool idea: derive productivity from mkt shares of same firm across countries
- Transferability of productivity to foreign affiliates (logs)

$$\varphi_{i,sn} = \varphi_i - \kappa_{s,n}$$

with $\kappa_{s,n} = \kappa_s + \alpha_l \text{lang}_{s,n} + \alpha_d \text{dist}_{s,n}$

- ▶ Are productivity transfers separable in firm vs. country components?
- ▶ Are affiliates mere recipients of parent's productivity?
- ▶ Is transferability one-way or two-way process?
- ▶ Are there other sources of complementarities between parent-affiliate?

**Transmission of technology
within
the Multinational Corporation**

Transmission of technology to foreign affiliates

- A micro structural approach: Bilir & Morales (2020)

Simplified version: no demand shocks, no capital nor materials, only labor

$$V[\{S_{it}\}_i] = \max_{\{C_{it}\}} \left\{ \sum_{i \in I_t} \Pi(S_{it}, L_{it}, P_{it}, R_{it}) + \delta E[V(\{S_{it+1}\}_i) | \{S_{i,t}, R_{i,t}\}_i] \right\}$$

where

State: $S_{it} = [\varphi_{it}, W_{nt}, Q_{nt}, P_{nt}]$

Control: $C_{it} = [L_{it}, P_{it}, R_{it}]$

Demand: $Q_{it} = Q_{nt} (P_{it}/P_{nt})^{-\sigma}$

Prod Fn: $Q_{it} = L_{it}^{\alpha} \exp\{\varphi_{it}\}$

Prod: $\varphi_{it} = \mu_{\varphi} \varphi_{i,t-1} + g(d_{i,t-1}, r_{i,t-1}, d_{0,t-1}, r_{0,t-1}) + \eta_{it}$

moreover:

Noise: $Y_{it} = P_{it} Q_{it} \exp\{\epsilon_{it}\}$

- Structure involves timing of effects and shocks \rightarrow identification

Transmission of technology to foreign affiliates

- **Step 1:** Static and flexible optimization of Labor (or materials)

- ▶ For each affiliate i :

$$\max_{L_{it}} P_{it} Q_{it} - W_{nt} L_{it}$$

$$\text{s.t. } P_{it} Q_{it} = P_{nt} Q_{nt}^{1/\sigma} [L_{it}^\alpha \exp\{\varphi_{it}\}]^{1-1/\sigma}$$

$$\begin{aligned} \text{foc}(L) : \quad W_{nt} L_{it} &= \left[\left(1 - \frac{1}{\sigma}\right) \alpha \right] \cdot P_{it} Q_{it} \\ w_{it} &= \ln(\tilde{\alpha}) + y_{it} - \epsilon_{it} \end{aligned}$$

- ▶ All information (except noise) embedded in static flexible choices:

$$\text{GMM} : E [y_{it} - w_{it} + \ln(\tilde{\alpha}) | L_{it}, i \in I_t] = 0$$

Transmission of technology to foreign affiliates

- **Step 2:** We are interested in μ

$$\tilde{\varphi}_{it} = \mu_{\varphi} \tilde{\varphi}_{i,t-1} + g(d_{i,t-1}, r_{i,t-1}, d_{0,t-1}, r_{0,t-1} | \mu) + \eta_{it}$$

- ▶ Use \hat{y}_{it} from Step 1 to derive affiliate- i 's productivity

$$\begin{aligned} P_{it} Q_{it} &= P_{nt} Q_{nt}^{1/\sigma} [L_{it}^{\alpha} \cdot \exp\{\varphi_{it}\}]^{1-1/\sigma} \\ y_{it} - \epsilon_{it} &= \nu_{nt} + \tilde{\alpha} l_{it} + \underbrace{(1-1/\sigma)\varphi_{it}}_{\tilde{\varphi}_{it}} \end{aligned}$$

→ Then: $\tilde{\varphi}_{it} = y_{it} - \underbrace{[\hat{\alpha} l_{it} + \hat{\epsilon}_{it}]}_{\hat{y}_{it}} - \nu_{nt}$

$$\text{GMM} : E[\eta_{it} | Z_{it-1}, \nu_{nt}] = 0$$

- ▶ Z_{it-1} : factors in $\tilde{\varphi}_{it}$ set at $t-1$ ($y_{i,t-1} - \hat{y}_{i,t-1}, d_{i,t-1}, r_{i,t-1}, d_{0,t-1}, r_{0,t-1}$)
- ▶ ν_{nt} : n-t Fixed effects

Results: Transmission of Technology

	Affiliate and Parent	Complementarities
Persistence	0.74*** (0.180)	0.74*** (0.018)
A's R&D elasticity		
Unconditional	0.0106*** (0.003)	0.0063 (0.004)
P's R&D>0		0.0070 (0.004)
P's R&D elasticity		
Unconditional	0.0122*** (0.004)	0.0133*** (0.004)
A's R&D>0		0.026*** (0.004)
Obs	4,008	4,008

Conclusion: Transmission of Technology

- R&D is more concentrated on Parent than production
 - ▶ R&D by the Parent increases productivity of foreign Affiliates
 - ▶ Substantially more if Affiliate complements with own R&D
 - ▶ Not shown: no cross-affiliate complementarities in R&D
- Some remaining questions
 - ▶ Is R&D specially transferable source of productivity (patent, product, technology)?
 - ▶ How do multinational activities affect P's incentives to innovate?
 - ▶ Decision to expand into foreign affiliates is also jointly determined...

**Joint process of
innovation and
multinational expansion**

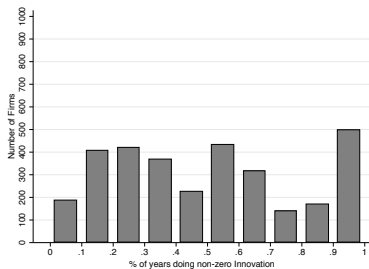
What is the difference between innovation and R&D?

1. Change in technology/organization at the inside of the firm, rather than pushing industry knowledge frontier

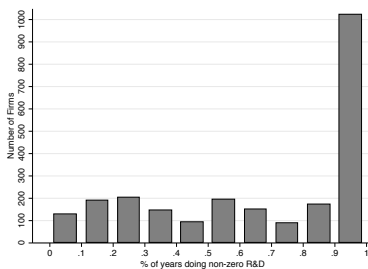
	Number of Patents _{it} (Poisson Regression)		
Product Innovation Freq _{it-1}	0.242 (0.312)		0.290 (0.356)
Process Innovation Freq _{it-1}		0.020 (0.294)	-0.106 (0.335)
$\ln(1 + R\&D\ Stock_{it-1})$	0.806*** (0.151)	0.828*** (0.165)	0.808*** (0.154)
Year FE	Yes	Yes	Yes
Firm FE	Yes	Yes	Yes
N	8494	8494	8494

What is the difference between innovation and R&D?

2. Variations in Innovation mostly at the extensive margin, while in R&D mostly at the intensive margin



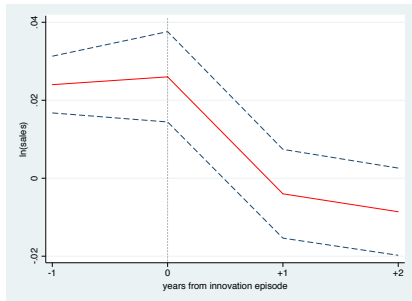
(a) Frequency of Process Innovations



(b) Frequency of R&D

How does innovation affect sales growth?

- High-growth firms innovate more often. But growth drops after innovation



	$\ln DomesticSales_{it}$	
	domestic	MNC
N Inn _{it}	0.031*** (0.005)	0.019* (0.010)
Trend _{$i \in s$}	-0.003 (0.007)	0.045** (0.022)
Time FE	✓	✓
Firm FE	✓	✓
Obs	10591	1217

Joint process of innovation and MNC expansion

- Innovation, growth and FDI
 - ▶ Baby MNCs innovate more often and grow faster than domestic
 - ▶ But growth drops upon first entry into multinational activities.

	$\Delta \ln(\text{Sales}_{it})$	$\Delta \ln(\text{DomSales}_{it})$	$\Delta \ln(X_{it})$
ΔFDI_{it+1}	-0.004 (0.031)	-0.052 (0.045)	0.222 (0.160)
ΔFDI_{it}	0.220* (0.122)	0.081 (0.176)	0.180 (0.251)
ΔFDI_{it-1}	-0.032 (0.022)	0.036 (0.050)	-0.174* (0.084)
ΔFDI_{it-2}	-0.077** (0.028)	-0.078** (0.036)	-0.162** (0.064)
Year FE	Yes	Yes	Yes
R^2	0.140	0.056	0.025

Propensity Score Matching: Industry, Initial Productivity and Size, and Export Status

How can we rationalize these facts?

- Firm- i profits at time t :

$$\pi_{it}(a, h, M) = M \underbrace{(a_{it}^{1/2} h_{it}^{1/2})}_{\varphi_{it}^{\sigma-1}}$$

$$\text{where: } M : \begin{cases} M_d &= \frac{(1-\sigma)^{1-\sigma}}{\sigma} \left[\left(\frac{P}{w}\right)^{\sigma-1} Y + \tau^{1-\sigma} \left(\frac{P^*}{w}\right)^{\sigma-1} Y^* \right] \\ M_m &= \frac{(1-\sigma)^{1-\sigma}}{\sigma} \left[\left(\frac{P}{w}\right)^{\sigma-1} Y + \kappa^{1-\sigma} \left(\frac{P^*}{w^*}\right)^{\sigma-1} Y^* \right] \end{cases}$$

- Technological capacity a_{it} : **innovation = replacement**

When no-innovation: $t \in (t_n, t_{n+1})$ $a_t = a_n$

When innovation: $t = t_n$ $a_{t_{n-1}} \rightarrow a_{t_n}$

- Expertise h_{it} : Continuous random process (ω is a Brownian motion)

$$\frac{dh_t}{h_t} = \mu dt + \sqrt{2} \sigma d\omega_t$$

The Model: Problem of the Firm

- MNC is absorbing state: Choose when and by how much to innovate

$$V_m(a_0, h_0) = \max_{\{t_N, a_N\}} E_0 \sum_{n=0}^{\infty} \left[\int_{t_n}^{t_{n+1}} \pi_m(a_n, h_t) e^{-rt} dt - a_n p e^{-rt_n} \right]$$

- Domestic firm: apart from innovation, also chooses if/when to enter

$$V_d(a_0, h_0) = \max_{\{t, a, t_M\}} E_0 \sum_{n=0}^{\infty} \left[\int_{t_n}^{t_{n+1}} [\pi_d(a_n, h_t) + \Delta\pi(a_n, h_t) \mathbf{1}_{t > t_M}] e^{-rt} dt - a_n p e^{-rt_n} \right] - e^{-rt_M} F_M$$

with: $t_N = [t_1, \dots, t_n, t_{n+1}, \dots]$: when to replace technology

$a_N = [a_1, \dots, a_n, a_{n+1}, \dots]$: by how much?

p : lumpiness comes from replacement of technology

t_M : when to acquire foreign unit

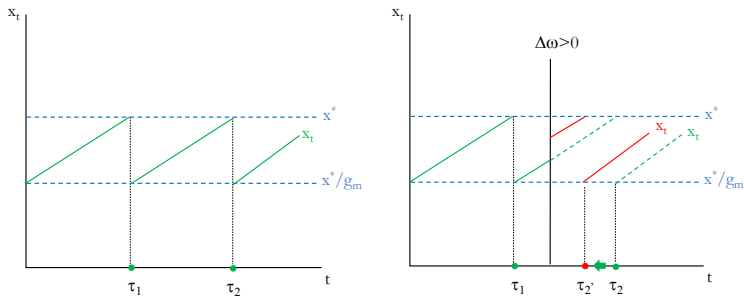
F_M : cost of multinational expansion is scale-invariant

Intuition of the Solution: Optimal Innovation once Multinational

- Accumulate expertise h until reaching h^* , then replace technology
 - Trigger capacity utilization x^* and growth rate g_m constant

$$x^* = M^2 \frac{h^*}{a} \rightarrow a' = a g_m$$

Figure: Capacity utilization ($x = M^2 h/a$)

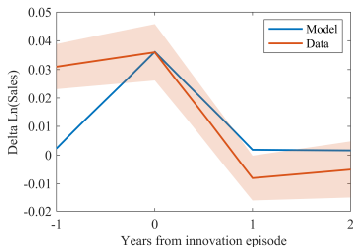


(a) No Shocks ($\Delta\omega = 0$)

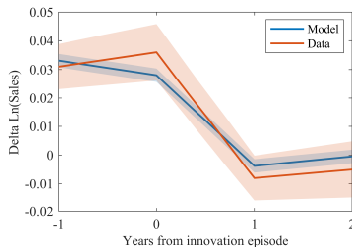
(b) Positive Shock ($\Delta\omega > 0$)

Intuition of the Solution: Optimal Innovation once Multinational

- Simulated and Real Data: regression around time of innovation
 - ▶ De-trended. Propensity score matching on initial conditions



(a) No uncertainty ($\sigma = 0$)



(b) Uncertainty ($\sigma = 0.05$)

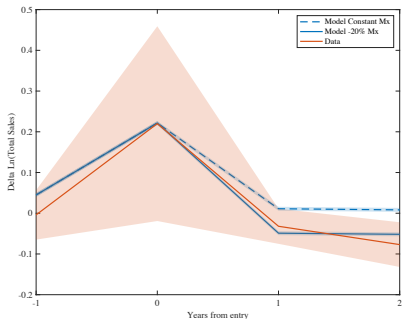
- Intuition for Calibration
 - ▶ Jump at 0: growth of technology \rightarrow governs cost/profit of innovation
 - ▶ Growth before 0: selection of the lucky ones \rightarrow governs volatility of shock

Intuition of the Solution: Optimal Entry into Multinational

$$M = \begin{cases} M_d & = \frac{(1-\sigma)^{1-\sigma}}{\sigma} \left[\left(\frac{P}{w}\right)^{\sigma-1} Y + \tau^{1-\sigma} \left(\frac{P^*}{w}\right)^{\sigma-1} Y^* \right] \\ M_m & = \frac{(1-\sigma)^{1-\sigma}}{\sigma} \left[\left(\frac{P}{w}\right)^{\sigma-1} Y + \kappa^{1-\sigma} \left(\frac{P^*}{w^*}\right)^{\sigma-1} Y^* \right] \end{cases}$$

HQ's Total Sales

- Random process & cost of innovation from MNC calibration
- Jump in growth (innovation)
→ 15% increase in market size for productivity improvements
- Decrease in sales growth
→ 20% MP substitution of exports
- From Data: median Baby MNC exports 30% of total sales



What do we learn from growth and innovation of Baby MNCs?

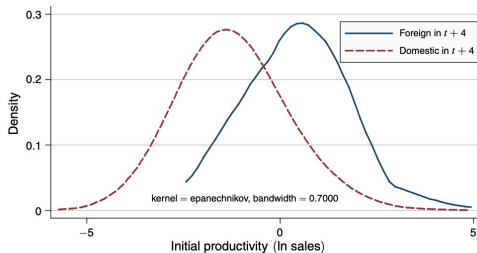
- Model-specific results
 - ▶ Innovation vs. R&D: Discrete options imply different performance around time of decision
 - ▶ Dynamic selection may bias naive OLS regression of FDI on productivity
- What are the GE effect? Some ideas
 - ▶ Parents become more productive
 - ▶ But split production towards foreign unit (substitute for Exports)
 - ▶ X and MP expansions have different impact on local price of inputs (and exit margin)
- Most FDI expansion in Spain (advanced economies) is M&A
 - ▶ Is export substitution the motive for foreign acquisitions?
 - ▶ Is the affiliates' superior productivity the result of transfer from Parent?
 - ▶ What do affiliates do upon acquisition?

Are Affiliates better
just because
they adopt Parent's technology?

What is the Source of Affiliates' Superior Productivity?

- Guadalupe et al. (2012)
 - ▶ Foreign affiliates are more productive and larger than domestic firms
 - ▶ But developed economies 89% of MNC entry is through M&A
 - Barba Navaretti & Venables (2004)
 - Target firms were **cherry-picked**

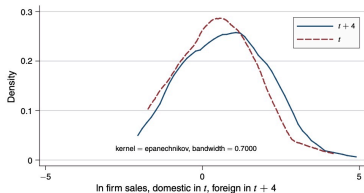
Figure: Foreign M&A: Selection of Target Firms



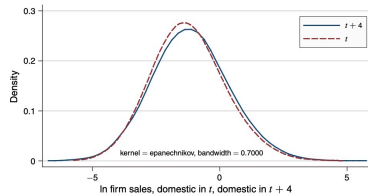
Data: Spanish manufacturing firms. Encuesta de Estrategias Empresariales

What is the Source of Affiliates' Superior Productivity?

- Target firms are originally top and become even better



(a) Acquired Firms



(b) Not-Acquired Firms

- ▶ Do they adopt parent's superior technology?
- ▶ Do they innovate more? Why? Lower cost of innovation? Higher benefits?

What is the Source of Affiliates' Superior Productivity?

- Innovation upon acquisition
 - ▶ Innovation in process (machinery and organization)
 - ▶ No new products nor adaptation of foreign technology

Dep. Variable	Process Inn	Product Inn	Foreign Tech
Lag Foreign	0.411*** (0.172)	0.219 (0.181)	-0.032 (0.108)
Foreign	0.046 (0.109)	-0.901 (0.113)	0.151 (0.110)
Forward Foreign	0.066 (0.149)	-0.042 (0.162)	0.108 (0.075)
obs	12,767	12,767	2,886
Firm FE	✓	✓	✓
Time FE	✓	✓	✓
Selection controls	✓	✓	✓

What is the Source of Affiliates' Superior Productivity?

- Mechanism: market expansion through MNC's network

Dep. Variable	In Exports	Exports/Sales		Process Inn
Lag Foreign	0.243* (0.136)	0.040*** (0.016)	Export via Parent	0.869*** (0.303)
Foreign	0.00 (0.271)	0.012 (0.019)	Export	0.160 (0.119)
Forward Foreign	0.084 (0.174)	0.012 (0.013)	Lag Foreign	0.608 (1.038)
			Export × Lag Foreign	-0.248 (1.026)
obs	12,767	7,026	obs	4,096
Firm FE	✓	✓	Firm FE	✓
Time FE	✓	✓	Time FE	✓
Selection controls	✓	✓	Selection controls	✓

What do we learn from Target firms?

- Selection and mechanisms
 - ▶ Selection is an equilibrium outcome given expected synergies and market for corporate control
 - Selection may bias naive estimations
 - ... But we can also learn a lot from the observed matching patterns
- Firms have multiple dimensions of heterogeneity
 - ▶ Is Target firms' network also a motive for acquisition?
 - ▶ Size of network and productivity?
 - ▶ Markups?
- GE effect?
 - ▶ Cherry Picking different from *greenfield* FDI

Infinite Topic

Variety of different approaches depending on
question, application, and data

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