Quantifying Productivity Gains from Foreign Investment

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- Large increase in FDI during recent decades
- An extensive literature searches for positive effects of FDI on growth and productivity:
 - Direct productivity effects (on acquired firms)
 - Knowledge spillovers from foreign-owned companies to domestic
- Micro literature typically focuses on single country. Results differ by developed/emerging countreis.
- Identification is a serious issue: selection and simultaneity

Selecting more or less productive firms

- Firm carefully decide in which firms to invest
- Corporate finance literature suggest under-performing firms are likely targets
- Empirically it appears that multinationals target more productive firms

Spillovers

- Why would there be spillovers? Suggested stories: imitation, labor mobility, competition (positive/negative), forward or backward linkages
- Simultaneity: a host of sector, time, firm unobserved variables potentially affect productivity:
 - country-time effects: reform may increase productivity and open economy for investment at the same time;
 - sector-time effects: technological breakthroughs, sector specific: cell phones, Internet, etc.

Aims of this paper:

- Provide evidence on firm-level productivity effects of FDI:
- Direct and Spillover effects of FDI
- Decompose spillover effects into "knowledge" spillovers and "competition" effects on domestic firms
- Backward (from foreign customers) and forward (from foreign suppliers) spillovers (compare to literature)
- Accounting for selection and simultaneity

Methodological contributions

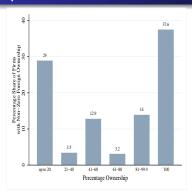
- Multiple country setting: control for sector-year patterns (simultaneity).
- Industrial vs Financial owners
- Exploit 4 digit sector classification:
- Address endogeneity using a new instrument.

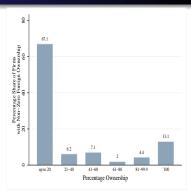
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Direct Effects
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Spillover Effects
Horizontal Spillovers - 4 digit
Vertical Spillovers
Firm Heterogeneity

- ORBIS database provided by Bureau van Dijk (BvD) (worldwide)
- Public firms are less than 1 percent of the data as opposed to COMPUSTAT, which is all public
- We use manufacturing only (to compare to literature)
- We use unconsolidated accounts.
- Collected from official registers, annual reports, and newswires
- Data shows fully list of direct and indirect shareholders and subsidiaries, company's degree of independence, its ultimate owner, all in time series
- Foreign Ownership (FO): For a firm i, FO_i is the sum of all percentages
 of direct ownership by foreigners.
- We distinguish between:
 - Industrial-FDI: Parent company industrial.
 - Financial-FDI: Parent company is a bank, financial company, private equity, mutual fund, or other financial institution.

Sample Direct Effects Instrumental Variables Spillover Effects Horizontal Spillovers - 4 digit Vertical Spillovers Firm Heterogeneity

Distribution of FDI Among Foreign Owned Firms: Developed Countries





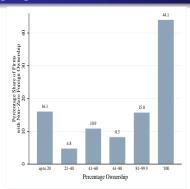
(a) Industrial FDI

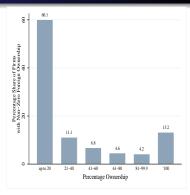




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Distribution of FDI Among Foreign Owned Firms: Emerging Market Countries





(c) Industrial FDI



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Are foreign-owned firms more productive? (Direct Effects)

Simple measure of productivity: Value Added

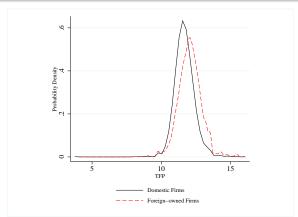
	(1)	(2)
LHS:	VA/L	VA/L
Firms:	Manuf.	Manuf.
Foreign Ownership	0.494***	0.002
	(0.011)	(800.0)
Firm fixed	no	yes
Sector fixed	yes	yes
Country-Year fixed	ves	ves

Total Factor Productivity (TFP)

$$\log TFP_{i,t} = \log(Y_{i,t} - M_{i,t}) - \alpha_1 \log L_{i,t} - \alpha_2 \log K_{i,t}$$

- Y: output, M: materials, L: employment and K: capital.
- α_1 and α_2 estimated, by country-sector, using the non-parametric approach of Levinsohn and Petrin (2003) and Wooldridge (2009) (WLP).

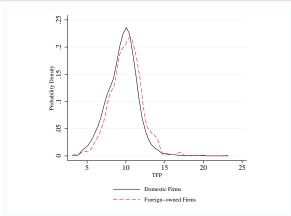
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TFP density distribution by foreign ownership: Developed Countries



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TFP density distribution by foreign ownership: Emerging Countries



Control for sector- and country-level trends

• Typical regression in (single-country) literature:

$$\log TFP_{i,s,t} = \beta FO_{i,s,t} + \alpha_i + \delta_t + \epsilon_{i,s,t}$$

where i: firm, s: sector and t: time. (Or, differences, rather than firm fixed-effect.)

• We estimate:

$$\log TFP_{i,s,c,t} = \beta FO_{i,s,c,t} + \alpha_i + \delta_{c,t} + \phi_{s,t} + \epsilon_{i,s,c,t}, \quad (1)$$

where $TFP_{i,s,c,t}$ is total factor productivity and $\delta_{c,t}$ and $\phi_{s,t}$ are country-year and sectoral-year fixed effects, respectively

(Controlling for sector-year patterns potentially important)



Construct Exogenous Sector-Country-Year Variation

- Potential bias if foreign investors target firms with predicted growing productivity (a potential firm-year effect)
- We construct new instrument
- Start at sectoral level
- Define sector, country <u>financial</u> investment as

$$I_{c,s,t}^{F} = \frac{\sum_{i \in c,s} FO_{i,t}^{F} \times Y_{i,0}}{\sum_{i \in c,s} Y_{i,0}} .$$

We assume that financial investors are passive investors who invest based on forecasted profit growth, but who do not actively change production.

Time-varying measure of growth in (sectoral) Foreign Ownership (cont.)

- **3** Define industrial investment $I_{c,s,t}^{l} = \frac{\sum_{i \in c,s} FO_{i,t}^{l} \times Y_{i,0}}{\sum_{i \in c,s} Y_{i,0}}$
- We assume industrial investment is determined by the same profit motive as financial investment,
- plus a term "A" which reflects further profit from active management (increased market power, etc.)

(2)
$$I_{c,s,t}^{I} = b * I_{c,s,t}^{F} + \delta * A_{c,s,t} + e_{c,s,t}$$
,



Sector-Level Instrument

- If we know coefficient b, we can use
- $I_{c,s,t}^I b \cdot I_{c,s,t}^F = \delta \cdot A_{c,s,t} + \text{error}$ as an exogenous instrument (at sector, country, year level) because endogenous E term has disappeared
- So we proceed as follows:
 - **1** Regress $I_{c,s,t}^I$ on $I_{c,s,t}^F$ and take residuals $\Rightarrow W_{c,s,t}$
 - **2** $W_{c,s,t} = I_{c,s,t}^{I} \hat{b} \cdot I_{c,s,t}^{F}$
- (had we had very long firm-level time series, would want to at firm level)



Instrument at Firm Level

- We assume that impact of sectoral exogenous investment is proportional to initial foreign ownership
- Generate $Z_{it} = FO_{i0} \cdot W_{c,s,t}$ and use as instrument where FO_{i0} is non-time varying initial FO of firm i
- Type of instrument first suggested by Acemoglu and Johnson (2007)
- Recall: firm fixed effect in regressions removes levels effects, so endogeneity of FO_{i0} is not a problem in general



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Table: Are Foreign Firms more Productive? (dep. var. log TFP)

	Developed			Emerging		
	GLS	GLS&IV	GLS&IV	GLS	GLS&IV	GLS&IV
log(FO)	0.007** (0.003)	0.031** (0.014)		0.048*** (0.010)	0.125 (0.108)	
$\Delta_2 \log({ t FO})$			0.023 (0.017)			0.116 (0.082)
Firm Fixed Eff	yes	yes	no	yes	yes	no
1st Stage Results						
F-Test		770.24	237.23		43.37	53.65
Obs	402,137	402,137	235,529	72,349	72,349	36,479



- Do domestic firms benefit (productivity) from foreign companies?
- Ambiguous evidence on spillover effects (horizontal):
- Explanations:
 - Absorptive capacity: human capital, local financial markets.
 - Competition/rivalry.
- We argue that to identify spillover effects we have to:
 - Separate positive knowledge spillovers from negative competition effects: precise sectoral FDI measure is needed
 - Address potential simultaneity concerns by including sector-year fixed effects



• Traditionally the literature on spillovers has estimated:

$$\log \mathit{TFP}_{i,s,t} = \beta \mathit{Spillover}_{s,t} + \alpha_i + \delta_t + \epsilon_{i,s,t}$$

• We estimate:

$$\log \mathit{TFP}_{i,s,c,t} = \beta \mathit{Spillover}_{s,c,t} + \alpha_i + \delta_{c,t} + \phi_{s,t} + \epsilon_{i,s,c,t}$$

 $\phi_{s,t}$ sector \times year fixed effects (dummies). $\delta_{c,t}$ country \times year fixed effects (dummies).

• Usual horizontal spillover (2-digit sectors): $Spillover_{s,t} = \sum_{i \in s} \omega_{i,t} FO_{i,t}$ where $\omega_{i,t} = Y_{i,t} / \sum_{i \in s} Y_{i,t}$

 Our spillover measures: finer level of aggregation: 4 digit

$$SpilloverCompetition_{s4,t} = \sum_{i \in s4} \omega_{i,t} FO_{i,t}$$

- where "s4" refers to the four-digit sector classification.

$$SpilloverKnowledge_{s4,t} = \sum_{i \in s2, \notin s4} \omega_{i,t} \ FO_{i,t}$$

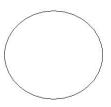


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29 Manufacture of Motor Vehicles



27 Manufacture of Electrical Equipment



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Are There Positive Spillover Effects on TFP from Foreign Ownership? (Domestic firms only.)

		Developed			Emerging	
DEPENDENT VARIABLE	log(TFP)	log(TFP)	log(TFP)	$\log(\text{TFP})$	$\log(\text{TFP})$	log(TFP)
${\rm Spillover}_{\mathfrak{s}2}$	0.026** (0.009)	0.008 (0.010)		-0.061*** (0.014)	-0.090*** (0.016)	
${\bf Spillover_Competition_{\it s4}}$			-0.028*** (0.004)			-0.080*** (0.011)
${\bf Spillover_Knowledge_{s4}}$			0.020** (0.008)			-0.078*** (0.018)
Sector2dig-Year Fix Eff. Sector4dig-Year Fix Eff.	no no	yes no	N/A yes	no no	yes no	N/A _yes

- Does increasing FO imply higher market shares?
- (Otherwise, competition story maybe not true)

$$\log MS_{i,s,c,t} = \alpha + \beta_1 FO_{i,s,c,t} + \alpha_i + \delta_{c,t} + \phi_{s,t} + \epsilon_{i,s,c,t}$$
 (2)

- where MS: share of firm "i" output in total sectoral output in her country.

Competition Spillover Channel: Output Market Shares (2nd stage displayed only)

DEPENDENT VARIABLE	Developed log MS4dig	Emerging log MS4dig
log FO	0.042** (0.017)	0.214* (0.125)
Observations Firms Firm Fix Eff. Ctry-4dig-Year F.E.	402,137 59,306 yes yes	72,349 12,758 yes yes
F-Test	770.24	43.37



- Failure to find positive horizontal spillovers lead researchers to search for vertical spillovers:
- Vertical Measures

$$Backward_{s,t} = \sum_{k \neq s} \alpha_{sk} Horizontal_{k,t}$$
 (3)

$$Forward_{s,t} = \sum_{m \neq s} \sigma_{mk} Horizontal_{m,t}$$
 (4)

where α_{sk} : proportion of sector "s" output supplied to (customer) sector "k", and σ_{mk} is the share of inputs purchased by sector "s" from (upstream, supplier) sector "m"



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DEPENDENT VARIABLE: FIRM PRODUCTIVITY

Sample: Domestic Firms

(1) (2) Backward Spillover 0.063** (0.023) 0.076** (0.034) Forward Spillover 0.027 (0.030) -0.089** (0.038) Horizontal Spillover 0.014* (0.009) -0.057*** (0.009) Observations 357,995 55,565 Firm Fixed Effects yes yes Country-Year Fixed Effects yes yes Sector2dig-Year Fixed Effects yes yes		Developed	Emerging
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Forward Spillover 0.027	Backward Spillover	0.063**	0.076**
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Firm Fixed Effects yes yes Country-Year Fixed Effects yes yes Sector2dig-Year Fixed Effects yes yes		(0.009)	(0.013)
Country-Year Fixed Effects yes yes Sector2dig-Year Fixed Effects yes yes	Observations	357,995	55,565
Sector2dig-Year Fixed Effects yes yes	Firm Fixed Effects	yes	yes
	Country-Year Fixed Effects	yes	yes
	Sector2dig-Year Fixed Effects		yes

Firm Heterogeneity: Spillovers by TFP fractiles

	DEVELOPED	Emerging
Spillover_Competition _{s4} \times 1st Quartile	-0.036**	-0.157***
	(0.014)	(0.030)
$Spillover_Competition_{s4} \times 2nd Quartile$	-0.009	-0.094***
	(0.007)	(0.018)
Spillover_Competition _{s4} \times 3rd Quartile	-0.021**	-0.060**
-	(800.0)	(0.018)
Spillover_Competition _{s4} × 4th Quartile	-0.070***	0.008
	(0.016)	(0.039)
Spillover_Knowledge _{s4} \times 1st Quartile	-0.008	0.064
	(0.028)	(0.046)
Spillover_Knowledge _{s4} \times 2nd Quartile	0.011	-0.073**
1 0 34 .	(0.013)	(0.029)
Spillover_Knowledge _{s4} \times 3rd Quartile	0.011	-0.203***
1 0 34 .	(0.014)	(0.031)
Spillover_Knowledge _s ₄ × 4th Quartile	0.072**	-0.052
1 0 54	(0.031)	(0.056)



So is FDI important for aggregate growth?

- Calculate effect of a doubling (huge change!) of foreign ownership from current levels in percent of aggregate assets implied by our point estimates.
- Developed countries: total effect of 1.1 percent
- 0.9 percent if the insignificant coefficient to Spillover_Forward is set to 0).
- Emerging countries: total effect of -0.4 percent
- (-1.2 percent if the insignificant coefficient to FO is set to 0).

FDI is not of first-order importance for economic growth.



Thank you for listening!