The Network Origins of Firm Dynamics

Contracting Frictions and Dynamism with Long-Term Relationships

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Weak Contract Enforcement and Long Term Relationships

Systematic differences in firm dynamics across countries (Hsieh-Klenow 2014)

Long term relationships can substitute for formal contract enforcement

- ullet static benefit: helps incentives o lower transaction costs
- potential cost: less likely to switch to better supplier

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Johnson, McMillan, Woodruff (JLEO 2002):

- Survey of firms in Eastern Europe
- · Belief in quality of courts varies across countries
- "If another firm you have never purchased from offered to supply this input for a price 10% lower than this supplier, would you purchase from the new firm instead of this supplier?"
 - ullet Custom inputs: less confidence in courts \Longrightarrow more likely to reject new offer
 - Standard inputs: little difference

Monarch (2020): US imports from China

• Firms in more contract intensive industries stay with suppliers for longer

What is the role of relationships in firm dynamics and allocative efficiency?

This paper

- 1. Motivational evidence from India/Pakistan, that contracting frictions increase relationship stickiness and reduce dynamism
- 2. Quantitative model with firm dynamics built on firm-to-firm trade
 - Contracting frictions induce relational contracting which leads to more stickiness in firm-to-firm relationships
 - ullet Productive firms are chosen less often as suppliers \Rightarrow aggregate productivity loss
- 3. Calibrate multi-sector version of model to Indian/Pakistani setting
 - Compare firm dynamics in model to data
 - See how firm dynamics change with contracting frictions (in model & data)
- 4. Perform counterfactuals where we reduce contracting frictions
 - Reduces dynamic losses from misallocation
 - Dynamic losses \approx 3x static losses (Boehm-Oberfield, 2020)

Literature

- Firm Dynamics:
 - Customer Capital: Luttmer (2011), Gourio Rudanko (2014), Afrouzi Drenik Kim, Argente
 Fitzgerald Moreira Priolo, Einav Klenow Levin Murciano-Goroff, Foster Haltiwanger Syverson (2016)
 - Input-Switching: Gopinath Neiman (2014), Lu Mariscal Mejia (2024), Damijan Konings Polanec (2014), Monarch (2022) Baqaee Burstein Duprez Farhi (2023)
 - Kortum-Klette: Lentz Mortensen (2008), Akcigit Kerr (2018), Garcia-Macia Hsieh Klenow (2019)
- Firm-to-firm trade
 - Firm heterogeneity, static: Oberfield (2018), Bernard Moxnes Ultveit-Moe (2018), Eaton Kortum Kramarz (2024), Bernard Dhyne Magerman Manova Moxnes (2022)
 - Deterministic Life Cycle: Chaney (2014) and Aekka Khanna
 - Dynamics with Frictions: Huneeus, Miyauchi, Martin Mejean Parenti (2023) and Fontaine Martin Mejean (2023)
- Frictions and Dynamism: Hopenhayn, Rogerson (1993), Hsieh, Klenow (2014), Akcigit Alp Peters (2021)
- Contracting frictions: Boehm (2022), Amirapu (2021), Boehm Oberfield (2020)
- Relational contracts: Kranton (1996), Hemous, Olsen (2018), Macchiavello Morjaria (2015,2021)

Data

- Indian Annual Survey of Industries, 1989/90-2014/15 (with gaps)
 - Plant-level panel survey of manufacturing plants
 - Sales/purchases by 5-digit outputs and inputs
- Supplement with Pakistan Value Added Tax data 2011-2019
 - Monthly Firm-to-Firm sales transactions, aggregated to annual level
 - Do not see products traded

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Contracting frictions in output market present when:

firms output is relationship-specific AND firm located in region with poor contract enforcement

- Relationship-specificity: Rauch '99, by 5-digit product (India), 4-digit industry (Pak.)
- Poor contr. enforecement: Avg. age of pending cases in states (India), districts (Pak.)
 For India, also use age of court as IV (Boehm & Oberfield, 2020)

Contracting friction in output markets ⇒ longer relationships (Pak)

	Depender	nt variable:	Length of R	delationship	(in Years)
	(1)	(2)	(3)	(4)	(5)
Age of pending cases (S) $ imes$ RelSpec $_S$	0.172* (0.076)				
Age of pending cases (B) \times RelSpec _S	0.145* (0.071)				
Age of pending cases (Min(B,S)) \times RelSpec $_S$		0.296** (0.038)	0.301** (0.039)		
Age of pending cases (Min(B,S)) $ imes$ EnforcementIntensity $_{b,s}$				0.0210* (0.0099)	0.0300 (0.013
B × S 4-digit Industry FE	Yes	Yes	Yes	Yes	Yes
B District FE	Yes	Yes		Yes	
S District FE	Yes	Yes		Yes	
S District × S 4-digit Industry FE			Yes		Yes
B District \times B 4-digit Industry FE			Yes		Yes
R^2	0.119	0.120	0.162	0.107	0.145
Observations	1629868	1631389	1629619	2058019	205615

 $^{+}$ p < 0.10, * p < 0.05, ** p < 0.01

Contracting frictions in output markets \Rightarrow lower variance of sales growth

	Dependent variable: $\sigma(\Delta \log Sales)_{d\omega}$					
	(1)	(2)	(3)	(4)		
Avg age of civil cases \times Rel. spec.	-0.0177*	-0.0187*	-0.0401*	-0.0385*		
	(0.0089)	(0.0088)	(0.016)	(0.016)		
$\Delta \log Sales_{d\omega}$		-0.273**		-0.273**		
, , , , , , , , , , , , , , , , , , , ,		(0.024)		(0.024)		
State FE	Yes	Yes	Yes	Yes		
5-digit Industry FE	Yes	Yes	Yes	Yes		
Estimator	OLS	OLS	IV	IV		
R^2	0.287	0.302	-0.000369	0.0207		
Observations	7574	7574	7574	7574		

Regression at the state \times industry level. Only state-industry cells with more than 5 observations used.

Dependent variable: standard deviation of residualized (by age, year, state and industry) annualized sales growth in each state-industry cell

Data from ASI, India

Contracting frictions in output markets ⇒ **lower exit rates (across all size bins)**

	Dependent variable: P(exit)				
	(1)	(2)	(3)		
Q1 Dummy	0.0739** (0.0018)				
Q2 Dummy	0.0253** (0.0016)	-0.0510** (0.0042)	-0.0493** (0.0046)		
Q3 Dummy	0.0131** (0.00091)	-0.0611** (0.0046)	-0.0636** (0.0053)		
Q4 Dummy	0.00789** (0.00062)	-0.0715** (0.0045)	-0.0770** (0.0053)		
$Q1 \times Relspec \times AvgAgeCourts$		-0.00621** (0.0024)	-0.00552* (0.0023)		
$Q2 \times Relspec \times AvgAgeCourts$		-0.00384* (0.0015)	-0.00422** (0.0015)		
$Q3 \times Relspec \times AvgAgeCourts$		-0.00469** (0.0013)	-0.00367** (0.0011)		
$Q4 \times Relspec \times AvgAgeCourts$		-0.00162 (0.0014)			
4-digit Industry \times Year FE District \times Year FE 4-digit Industry \times District FE		Yes	Yes Yes Yes		
R ² Observations	0.0522 407189	0.0536 300384	0.0764 299802		

Data from Pakistan

Model: Single Industry

- Growing industry with many firms. Two types of firms: manufacturers, retailers
- Each firm produces using labor and one input:

$$y_b = A(z_{bs}x_s)^{\alpha}I^{1-\alpha},$$
 $A \equiv \alpha^{-\alpha}(1-\alpha)^{-(1-\alpha)}$

- Single shocks process: new potential buyer-supplier matches arrive via Poisson process
 - ullet Each new potential match: random supplier s, random match-specific productivity z_{bs}
 - Buyer's decision: switch or not
- Large number of retailers
 - Same production function & supplier arrival process as manufacturers
 - Sell output to household (but not to other manufacturers or retailers)
 - Manufacturers sell to other firms and to retailers, but not to household

Static Equilibrium

- Representative Household
 - ullet Dixit-stiglitz preferences across varieties sold by retailers (elast. arepsilon)
 - ullet Households inelastically supplies a growing quantity of labor L (growth rate γ)
 - Labor used for production or to create new manufacturers and retailers
- Market structure
 - Monopolistic Competition across retailers
 - Bilateral contracts in firm-to-firm trade (quantity, transfer)
 - Countably stable: no countable coalition wants to alter/drop contracts
 - ⇒ Efficient production within supply chains (quantities)

$$c_b = \left(\frac{c_s}{z_{bs}}\right)^{\alpha} w^{1-\alpha}$$

- Many ways to split surplus
 - Focus on equilibrium in which surplus split according to cost shares

Keeping the model tractable

- State variable for a firm is, in principle, very large
- We focus on one economic decision:
 - New supplier comes along: switch or not
 - Easy if each supplier's (log) cost is random walk with the same distribution of increments: lower cost now
 better distribution of future cost (FOSD)
- Key characteristic: no mean reversion in cost

What makes this work?

- Productivity of new potential match inspired by current supply chain
- No option to go back to old supplier
- No supplier death

Productivity of new potential match inspired by current supply chain

• Productivity delivered by current chain is

$$q\equiv z_0z_1^{\alpha}z_2^{\alpha^2}...$$

where $z_0, z_1, z_2, ...$ are firm's own, its supplier's, its supplier's supplier's...

• match-specific prod. with new potential supplier:

• The arrival rate of new suppliers with original component larger than b is

$$\kappa b^{-\beta}$$

 \implies Arrival rate of supplier that delivers cost reduction larger than x is

$$\phi x^{-\beta}$$
, $\phi \equiv \kappa \int (c_s/w)^{-\beta} dF(c_s)$

Entry and Exit

To have an ergodic distribution for cost, assume a growing mass of entrants

- Population grows at rate γ , $L_t = L_0 e^{\gamma t}$
- Entry
 - Free entry: unit of labor \implies flow χ of manufacturers and χ_R of retailers
 - $\bullet \implies$ Along BGP, flow of entrants grows at population growth rate, γ
 - Each entrant draws potential suppliers:

The number of draws of techniques with match-specific component larger than z is Poisson with mean $\kappa_0 z^{-\beta}$

- Exit
 - Firms never die. But if no customers, output is zero
 - A firm "exits" when it loses its last customer
 - May gain customers later, still draws new suppliers, etc
- ullet Under these assumptions: MGF of change in $\log \frac{w}{cost}$ over interval with length au

$$\mathbb{E}\left[\left(\frac{cost_{j,t}}{cost_{j,t+\tau}}\right)^{s}\right] = e^{-\tau\phi\sum_{k=1}^{\infty}\frac{s}{\beta\alpha^{-k}+s}}$$

Aggregate Output along BGP

Aggregate output is

$$Y_t = \left(|R_t|\int_0^\infty c^{1-arepsilon} dF(c)
ight)^{rac{1}{arepsilon-1}} (1-\eta) L_t$$

In special case where $\beta=\varepsilon-1$, output per capita is

$$\frac{Y_t}{L_t} = (1 - \eta) \left(\frac{\eta \chi_R}{\gamma} L_0\right)^{\frac{1}{\beta}} \left[\frac{\kappa_0^{\alpha} \Gamma(1 - \alpha)}{1 + \frac{\phi}{\gamma} \sum_{k=1}^{\infty} \frac{1}{1 - \alpha^{-k}}}\right]^{\frac{1}{1 - \alpha} \frac{1}{\beta}} e^{\frac{\gamma}{\beta} t}$$

- ightarrow Semi-endogenous growth
 - Distribution of cost in cross section is constant over time
 - Growth from gains from variety
 - Firm-level dynamics matter for level of output along BGP

Calibrate multi-sector version of model

ullet Firm b in industry ω

$$y_b = A_\omega I^{\alpha_{\omega I}} \prod_{\omega'} (z_{bs'} x_{s'})^{\alpha_{\omega \omega'}}$$

 $\alpha_{\omega I} + \sum_{\omega'} \alpha_{\omega \omega'} = 1$

$$A_{\omega} \equiv \alpha_{\omega I}^{-\alpha_{\omega I}} \prod_{\omega'} \alpha_{\omega \omega'}^{-\alpha_{\omega \omega'}}$$

- Calibrate to Indian data on 5-digit industries
- ullet Some industries ω produce relationship specific goods
 - Less efficient courts \Rightarrow lower arrival rate κ for relationship-specific inputs
 - Microfoundation through relational contract: buyer reduces search intensity for new suppliers to increase continuation value of the relationship

with

Value	Target	Target value	Data source	
0.04	Employment share by age		Hsieh & Klenow (2014)	
3.52	Δ cost from new suppliers	-0.284	Baqaee et al. (2023)	
0.58	Mean relationship length	1.72 years	Pakistan data	
varies	Median sales above threshold	6.36	Pakistan data	
60	Annual exit probability	0.05		
4.52	$\beta+1$			1
	0.04 3.52 0.58 varies 60	 0.04 Employment share by age 3.52 Δ cost from new suppliers 0.58 Mean relationship length Varies Median sales above threshold Threshold 60 Annual exit probability 	$ \begin{array}{cccc} 0.04 & \text{Employment share by age} \\ 3.52 & \Delta \cos \text{f rom new suppliers} & -0.284 \\ 0.58 & \text{Mean relationship length} & 1.72 \text{ years} \\ \text{varies} & \frac{\text{Median sales above threshold}}{\text{Threshold}} & 6.36 \\ 60 & \text{Annual exit probability} & 0.05 \\ \end{array} $	$ \begin{array}{cccccccccccccccccccccccccccccccccccc$

One shock, many subtle firm dynamics patterns

Firm size depends on fundamentals (cost) but also on demand (number & size of customers)

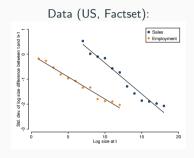
Model explains key firm dynamics facts:

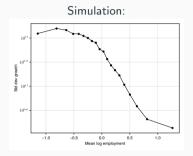
- Size-variance relationship
- Fat tails in firm growth rates
- Exit rates declining in size
- Existence of "gazelles"

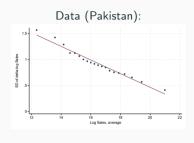
When enforcement is worse:

- Lower variance of firm growth \rightarrow evidence: see earlier results
- Less mean reversion in firm size
- Less skewed size distribution
- Lower exit rate → evidence: see earlier results

Standard Deviation of Growth Rates by Size

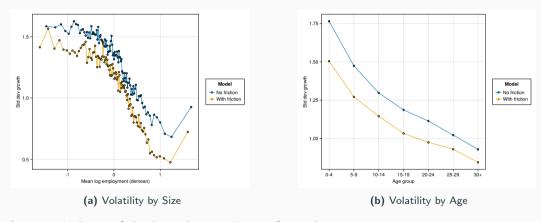






- Larger ⇒ lower standard deviation of growth rates (Hymer and Pashigian, 1962)
 - ullet Usual mechanism: Large firms composed of more subunits \Longrightarrow diversification
 - Here: Large firm tends to have more customers
- Declines more slowly than $\sqrt{\text{size}}$
 - Usual mechanism: correlation across subunits, granular subunits
 - Here: granular customers (also some correlation from cost changes) Comparison

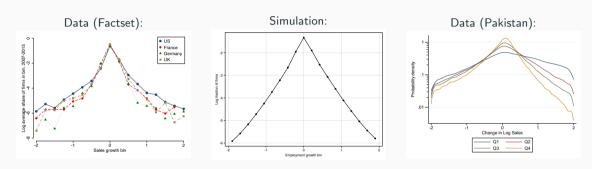
Standard Deviation of Growth Rates: Frictions vs No Frictions (Model)



Lower arrival rate of shocks \Rightarrow lower variance of growth rates

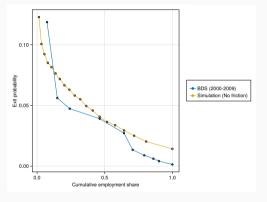
Empirical Evidence: see table at beginning of talk

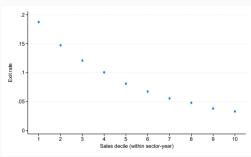
Distribution of Growth Rates has Fat Tails



- Fat tails: Ashton, 1926, Laplace dist: Stanley, et al. (1996)
- Here: Mixture of getting one large customer, many small customers

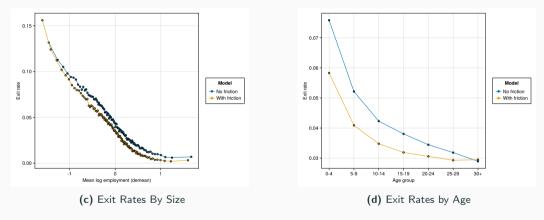
Exit rates decline with size





- Firms exit when they lose last customer
- Large firms can have one large customer
- Number of buyers is a good predictor of exit

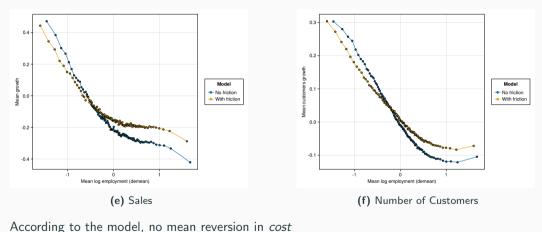
Exit Rates: Frictions vs No Frictions (Model)



Lower arrival rate of shocks \Rightarrow lower probability of losing last customer

Empirical Evidence: see table at beginning of talk

Mean Reversion: Frictions vs No Frictions (Model)



But: mean reversion in sales towards a long-run level commensurate with costs With fictions (\rightarrow less turnover) slower mean-reversion in sales

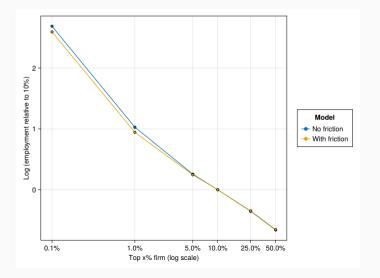
Mean reversion in firm size: slower with frictions

	Dependent variable: Change in log Sales						
	(1)	(2)	(3)	(4)	(5)	(6)	
$\log Sales_{t-1}$	-0.403** (0.011)	-0.427** (0.025)	-0.555** (0.037)	-0.403** (0.012)	-0.436** (0.028)	-0.583** (0.038)	
$logSales_{t-1}\!\timesAgeciv.cases\timesrelspec$	0.00709 ⁺ (0.0037)	0.0206* (0.0096)	$0.0249^{+} \ (0.015)$	0.00687 (0.0044)	0.0256* (0.012)	0.0405* (0.019)	
Plant × 5-digit Industry FE State FE	Yes Yes	Yes	Yes	Yes Yes	Yes	Yes	
Year × Previous Year FE Age FE Industry × District × Year FE	Yes	Yes Yes	Yes	Yes	Yes Yes	Yes	
$egin{aligned} Industry imes District imes (t,t-1) \; FE \end{aligned}$ Method	OLS	OLS	Yes	IV	IV	Yes	
R^2 Observations	0.457 204518	0.636 78053	0.671 51401	0.256 204518	0.250 78053	0.278 51401	

Standard errors in parentheses, clustered at the state \times industry level.

Size Distribution: less fat tails with frictions

Model simulation:



Contracting frictions in output markets ⇒ **lower skewness in size distribution**

	Dependent variable: Skewness of log Sales						
	(1)	(2)	(3)	(4)	(5)	(6)	
Relspec x Court Congestion	-0.360* (0.168)	-0.671* (0.287)	-0.799** (0.294)	-0.624 ⁺ (0.349)	-1.312* (0.598)	-0.905 (0.578)	
R^2	0.540	0.435	0.554	0.001	0.000	0.007	
State FE	Yes	Yes	Yes	Yes	Yes	Yes	
5-digit Industry FE	Yes	Yes	Yes	Yes	Yes	Yes	
Estimator	OLS	OLS	OLS	IV	IV	IV	
Statistic	25-75	50-75	50-90	25-75	50-75	50-90	
Observations	3008	3008	1448	3008	3008	1448	

$$\mathsf{Skewness}_{s\omega} = \frac{\log \left(\mathsf{Share\ of\ plants\ above\ } S_1\right) - \log \left(\mathsf{Share\ of\ plants\ above\ } S_0\right)}{\log S_1 - \log S_0}$$

 S_0 and S_1 are different quantiles of overall plant size distribution (25th, 50th, and 75th, 90th)

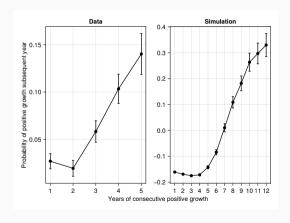
Similar with Pakistan data Pakistan

"Gazelles" / "rockets" / type dependence / ex ante heterogeneity

- Luttmer (2011): Need "rockets" that eventually slow to explain why largest firms are not so old
- Sedlacek, Sterk, Pugsley (2021): Hidden "ex ante heterogeneity" explains most of size dispersion at young ages, almost half of size dispersion at twenty
- Coad, Daunfeldt, Halvarsson (2018): autocorrelation of growth rates is positive for young firms and negative for older firms

Here: cost is hidden type

- · Cost determines inflow of customers
- Low cost at birth ⇒ persistent growth until inflows equals outflows
- Cost evolves over time



Counterfactual: reduce contracting frictions

Reducing average age of pending court cases by 1 year

 \Rightarrow 0.26 years longer relationships on average (for rel-spec. industries)

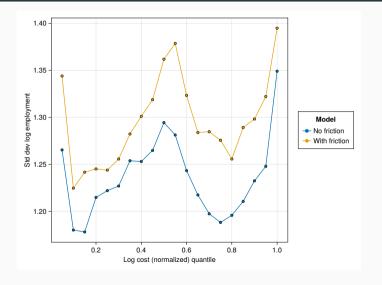
Counterfactual: change arrival rate of new suppliers κ (or ϕ) accordingly, to move from average age of pending cases of 4 years to 1 year

Reduces misallocation: firms with low cost get drawn as suppliers more often, large but unproductive firms shrink

	No friction	With friction
Mean income growth	0.015	0.015
Log real income difference	0.000	-0.162

Agg. productivity loss from dynamic misallocation \approx 3x static loss (Boehm & Oberfield, 2020)

Reducing friction \Rightarrow reduce size dispersion within each cost quantile



Thank you!

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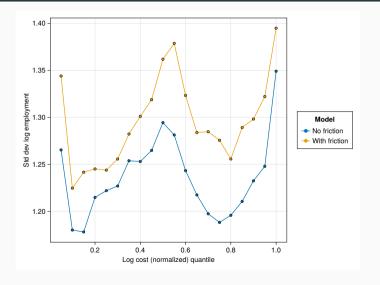
Implications for Aggregate

Productivity

Productivity

- \bullet Productivity growth is $\frac{\gamma}{\varepsilon-1}$
 - Gains from variety/Population growth
- Weak enforcement affects level of productivity
- Misallocation: Firms use worse suppliers than they would with better enforcement

Misallocation: Dispersion in Size



Misallocation: Correlation of Log Cost and Log Employment

Model	Correlation (demeaned)	Correlation (normalized)
No friction	-0.281	-0.370
With friction	-0.260	-0.340

Aggregate Productivity

	No friction	With friction
Mean income growth	0.015	0.015
Log real income difference	0.000	-0.162

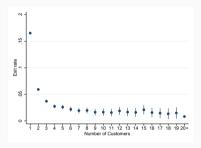
- Note: In counterfactuals, entry rate held fixed
- \bullet More severe contracting frictions \implies lower entry (impact on welfare not obvious)

Conclusion

- One response to weak contract enforcement is to use relational contracts
- Static benefits, but less switching
 - \Rightarrow Slower firm dynamics
 - ⇒ Cost penalty builds up over time
 - \bullet Not switching in past \implies large impact on current aggregate productivity
- \bullet Dynamic costs of bad enforcement are ${\sim}3$ times the size of static costs

Appendix

Number of Buyers is Good Predictor of Exit Back



			Dependent variable: P(ex	×it)
	(1)	(2)	(3)	(4)
Constant	0.0878** (0.00039)	0.0879** (0.00038)	0.0878** (0.00038)	0.0879** (0.00038)
Fixed Effects	Year	Year, #Buyers	Year, Sales vingtiles	Year, #Buyers, Sales vingtiles
R ² Observations	0.0293 501828	0.0889 501431	0.0976 501828	0.112 501431

Standard errors in parentheses, clustered at the industry-region level.

 $^{+}$ p < 0.10, * p < 0.05, ** p < 0.01

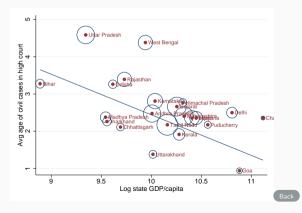
Determinants of Firm Growth Volatility

		Data (Pakistan)					Simulation			
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
log(Sales)	-0.138		-0.092	-0.105	-0.103	-0.3021		-0.2424	-0.2259	-0.2256
	(0.0018)		(0.0025)	(0.0022)	(0.0022)	(0.0007)		(0.0009)	(8000.0)	(0.0008)
log(Buyers)		-0.217	-0.111				-0.4962	-0.1845		
		(0.0031)	(0.0042)				(0.0014)	(0.0018)		
log(HHI)				0.152	0.202				0.3179	0.4224
,				(0.0055)	(0.0067)				(0.0017)	(0.0112)
log(HHI (weighted))				` ′	-0.051				, ,	-0.1058
(((((((((((((((((((((0.0037)					(0.0112)
Fixed Effects										
Industry	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Statistics										
R^2	0.263	0.244	0.286	0.287	0.289	0.7667	0.7393	0.7713	0.781	0.781
R ² -within	0.197	0.175	0.221	0.223	0.225	0.2674	0.1814	0.282	0.3123	0.3124
Observations	23,034	23,034	23,034	23,034	22,552	538,784	538,784	538,784	538,784	538,784

 $Standard\ errors\ in\ parentheses.\ The\ dependent\ variable\ is\ the\ log\ standard\ deviation\ of\ log\ sales_{t+1}-log\ sales_t.$

Slow Courts

- Contract disputes between buyers and sellers
- District courts can de-facto be bypassed, cases would be filed in high courts
- Court quality measure: average age of pending civil cases in high court



Mean Reversion: Pakistan

	Dependent variable: Change in log Sales				
	(1)	(2)	(3)		
$\log Sales_{t-1}$	-0.310**	-0.347**	-0.359**		
	(0.0053)	(0.018)	(0.022)		
$\log Sales_{t-1} \times Age \; civ. \; cases \; \times \; rel.spec.$		0.0191*	0.0216*		
		(0.0082)	(0.0095)		
Firm × 4-digit Industry FE	Yes	Yes	Yes		
District FE	Yes	Yes			
Year FE	Yes	Yes			
Age FE			Yes		
$Industry \times District \times Year FE$			Yes		
R^2	0.368	0.370	0.432		
Observations	214380	164552	154912		

Standard errors clustered at the district \times industry level. Conditions on $|\Delta \log \mathsf{Sales}| < 1$.

Skewness of Size Distribution: Pakistan

	Dependent variable:		Skewness of log Sales	
	(1)	(2)	(3)	
Avg age of civil cases \times Rel. spec.	-1.627*	-2.347**	-2.603*	
	(0.795)	(0.798)	(1.240)	
District FE	Yes	Yes	Yes	
4-digit Industry FE	Yes	Yes	Yes	
Statistic	25-75	25-90	50-90	
R^2	0.540	0.623	0.546	
Observations	854	653	653	

 $^{^{+}}$ p < 0.10, * p < 0.05, ** p < 0.01

$$\mathsf{Skewness}_{s\omega} = \frac{\log\left(\mathsf{Share\ of\ plants\ above\ } S_1\right) - \log\left(\mathsf{Share\ of\ plants\ above\ } S_0\right)}{\log S_1 - \log S_0}$$

 S_0 and S_1 are different quantiles of overall plant size distribution (25th, 50th, and 75th, 90th)



Notes on Pakistan

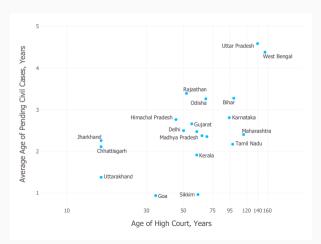
- 7 states, almost all economic activity is in two states, Sindh and Punjab
- All of our data is in district courts
- VAT data: Size threshold: varies across years. 2-3k per year 15k per year
- Can still register for VAT
- Small firms effectively face sales tax
- Some sectors (notably agriculture, some services, companies owned by army) excluded from VAT
- For manufacturing, sum across firms of reported VA in data of firms represents 89% manufacturing VA as reported by National Accounts (for whole economy, much lower 30-40%)
- Currently use all transactions, whether reported by one or both parties. If parties disagree on value, use geometric mean of reported transactions
- Firms reports total sales separately from transactions For size, use declared sales of firm, not sum of transactions
- Remove invoice mills
- For firm: age (date registered), two digit industry codes (sometimes there is a product

Endogeneity: IV

• Since independence: # judges based on state population

 \Rightarrow backlogs have accumulated over time

• But: new states have been created, with new high courts and clean slate



Aggregate Output along BGP

Output per capita along the BGP when $\beta \neq \varepsilon - 1$ is

$$\frac{Y_t}{L_t} = (1 - \eta)^{\frac{\beta}{\varepsilon - 1}} \left(\frac{\eta \chi_R}{\gamma} L_0\right)^{\frac{1}{\varepsilon - 1}} \left[\frac{\Gamma\left(1 - \frac{\alpha}{\beta}\left(\varepsilon - 1\right)\right)}{1 + \frac{\phi}{\gamma} \sum_{k=1}^{\infty} \frac{\varepsilon - 1}{\varepsilon - 1 - \beta\alpha^{-k}}}\right]^{\frac{1}{\varepsilon - 1}} \left[\frac{\kappa_0 \Gamma\left(1 - \alpha\right)}{1 + \frac{\phi}{\gamma} \sum_{k=1}^{\infty} \frac{1}{1 - \alpha^{-k}}}\right]^{\frac{\alpha}{1 - \alpha}} e^{\frac{\gamma}{\varepsilon - 1}t}$$

Weak Enforcement and Relational Contracts

- Contract specifies level of defectiveness $\delta \in [0,1]$. Surplus maximized at $\delta = 0$.
 - Supplier can produce defective input. Saves in cost, but possibility output will be defective.
 - Claim can be enforced in court.
 - But delay in court reduces value of payment
 - Cost proportional to value of transaction
- Static Nash: Supplier makes defective input, court. Priced in, but static surplus \$\perp\$
- Relational contract
 - Supplier chooses $\delta = 0$
 - Buyer chooses lower arrival rate of new suppliers (observable to supplier, not court)
 - Backloads payoff, raises surplus of the relationship
 - Enforcement: Trigger strategies
 - If supplier does not customize, buyer does not reduce arrival of new suppliers
 - Punishment for defective inputs: Relationship ends faster + enforcement in court
 - If buyer does not reduce arrival rate, supplier stops customizing

