Tailoring Contract Farming to Smallholders: Experimental Evidence on Enrollment Impact, Insurance Provision and Communication Technologies

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Introduction

Agricultural transformation: shift to more complex organizational forms

SSA: growth of contract farming

- Commitment to sell/purchase
- Buyer provides inputs on credit

Opportunities for research

- Administrative data (long panels)
- Partnership with large companies for experiments
 - Synergies with organizational economics

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- Insurance: Design and payment
- Information: Communication frictions along supply chain

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Sugarcane Contract Farming in Kenya

Partnership with large sugar company in Western Kenya

- Sector established in the Seventies
- Most important commercial crop in the region
 - Most farmers grow maize for consumption
- Government owned, then privatized
- Small nucleus estate + large outrgrowing scheme
 - Outgrowers harvest cycles are staggered (18-month cycle)

Sugarcane Contract Farming in Kenya (cont'd)

- Around 130,000 contracted cane plots
 - Most plots <1ha</p>
 - Contract: 1 plant and 2+ ratoons
- Price regulation (Kenya Sugar Board)
 - Farmer's price based on harvest price
- Company provides inputs on credit
 - Seedcane, fertilizer, harvesting, transport
 - Independent contractors provide inputs to cane suppliers
- Outgrower tasks: weeding, fertilizer application

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Administrative plot-level data

"Insider Econometrics": access to all the company data

- Name of contracting farmer
- Geographical information on the plot
- Cane age and variety
- Company inputs delivery dates and charges
- Plot size, output, and net revenues

Research Collaboration

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Ongoing

- Productivity dynamics (digitized old administrative data)
- Conditional cash advances to cane suppliers
- Communication technology, farmers' and firm productivity

Planned

- Randomizing new farmers joining the scheme
- Outgrowers' agricultural insurance

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Agricultural Insurance for Outgrowers

Understanding drivers of insurance take-up still a priority

• Cole et al. (2008), Karlan et al. (2012), Carter (2012)

Risks for cane farmers

- Rainfall
- Cane fires
- Delayed input delivery
- Nesting insurance in CF could help along two dimensions
 - Intertemporal choice
 - Basis risk

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Insurance as intertemporal decision

Insurance as intertermporal choice: premium t_0 , indemnity t_1

- Impatience
- Liquidity constraints
- Loss aversion

Intervention: insurance premia as deduction (400 farmers)

- T: insurance offered on credit
 - Good state: premium deduction at harvest (+*i*)
 - Bad state: indemnity paid at harvest (subtracting premium+i)
- C: insurance premium paid at t₀
 - Related work: Ahmed et. al (ongoing), Carter et al. (2010)

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Premia as Deductions

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Outcome: take-up rate

• Selection?

Possible Extension: Insurance and "CF Take-up"

• Are farmers more likely to enter CF if offered insurance?

External validity: theory

- Disentangle impatience, liquidity constraints, loss aversion
 - Baseline survey: discount rates, liquidity constraints
 - Intervention twists (?)

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Contract Farming and Basis Risk

Basis risk reduces demand for insurance

• Clarke (2011), Mobarak and Rosenzweig (2012), Elabed et al. (2013)

Source of basis risk in rainfall insurance

- Other risks besides rainfall
- Measurement error in rainfall
 - Distance station-plot
 - Specificity of rainfall moments used for index

CF scheme has rich plot-level yield data \Rightarrow Area Yield Insurance

- Miranda (1991), Carter (2007, 2012)
- India National Agricultural Insurance Scheme (25 million people)

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Area Yield Insurance

Sample Size: 3,000 farmers (co-funding)

Step 1: Randomize insurance type (area size)

- Own-plot vs. "field" vs. "sublocation" vs. control
 - Basis Risk ↘ when AS/MH ↗

Step 2: Offer insurance with lower basis risk to random subset

- Disentangle AS vs. MH in different insurance products
 - Karlan and Zinman (2009), Gunnsteinsson (2013)

Outcomes: what's the optimal area size in this trade-off?

- Take-up
- Farmer inputs, agricultural profits, default

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Insurance Experiments: Next Steps

• Use rich admin data to perform actuarial calculations

- Actuarial calculations consultant
- Finalize insurance product(s) design
 - Area size options
 - How to make products "comparable"?
 - Area yield insurance or "area net-revenue" insurance?
- Determine insurance provider
 - Company vs. third-party provider
- Scalability (superstition aside...)
 - Company support; scalability potential to 140K farmers
 - Review of CF in East Africa to identify potential partners

Randomizing Outgrower Recruitment

- Company expanding (new zones, new farmers in old zones)
- Company agreed to randomize recruitment (one-cycle)
 - CF includes "new crop"
 - Randomize among farmers expressing interest (2,000 total)
 - Policy relevant LATE
- Extension (?): purchase-commitment vs. input-supply
 - Feasibility yet to be confirmed

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Randomizing Recruitment: Outcomes

Outcomes

- Agricultural and non-agricultural Income
- Agricultural technology adoption
 - Spillover to other crops?
- Food security
 - Cash crop vs. subsistence crops debate
 - Gugerty and Schneider (2010)
- Contract enforcement (if able to experiment multiple models)

Heterogeneity in impact of joining CF

- Farmer wealth and total land cultivated
- Farmer gender
- Cane plot ownership/tenancy status.

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Randomizing Recruitment: Next Steps

- Identifying target zones among catchment area
- Randomization unit (plot vs. field)
- Power calcs: pilot survey in next 2 months
- Synergies with insurance project?

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Communication along the Supply Chain

(some work also joint with Sendhil Mullainathan)

- Low ratio of extension agents to cane suppliers
 - Around 100 field assistants
- Long distance between plots and company field offices
- Delays in input deliveries to cane suppliers
 - Independent contractors

Can ICT reduce communication frictions along the value chain?

ICT and Supply Chains: Preliminary Results

Two Interventions (RCTs):

- 1. Farmer Hotline
 - Farmers report queries on company performance
 - Input delivery delays, payment delays
 - Likelihood fertilizer arrives in time up by 13% (control mean 57%)

2. Personalized SMSs sent to farmers

- Reminders+Information (based on cane age and cycle)
- When to weed, trashline, apply fertilizer
- Increase in outgrower plot yields: 7%

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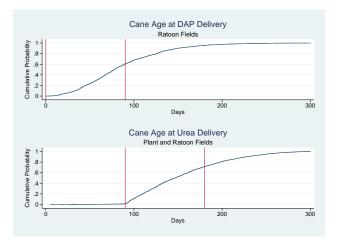
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Baseline Fertilizer Deliveries

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Farmer Hotline: Preliminary Results

	Urea Delivered			Ln(Age) Urea Delivered			Urea within 6 months		
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
Hotline	0.039	0.046^{**}	0.031	-0.055**	-0.047*	-0.062**	0.074^{**}	0.089^{***}	0.061^{*}
	[0.024]	[0.023]	[0.027]	[0.027]	[0.027]	[0.031]	[0.033]	[0.033]	[0.037]
Sample	All	Participants	Non-Part.	All	Participants	Non-Part.	All	Participants	Non-Part.
Mean Y Control	0.775	0.772	0.778	5.047	5.058	5.037	0.569	0.550	0.587
Observations	8414	4041	4373	6592	3187	3405	7292	3494	3798

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Outgrowers SMS: Preliminary Results

	Yields		Yields Winsorized		Log Yields	
	(1)	(2)	(3)	(4)	(5)	(6)
ITT_cell	4.218^{**}	3.348^{**}	3.116^{*}	3.105^{**}	0.070	0.074^{*}
	[1.941]	[1.482]	[1.648]	[1.407]	[0.046]	[0.039]
Controls		Х		Х		Х
Mean Y Control	41.645	41.645	41.421	41.421		
Observations	1845	1845	1845	1845	1845	1845

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Capacity Building in Kenya

- Peer research collaboration
- Faculty and Ph.D. students training
- Ph.D. students research funding
- Partner company staff research funding
- Master degree scholarships

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