

# Mechanizing Agriculture: Impacts on Labor and Productivity

JULIETA CAUNEDO

NAMRATA KALA

Cornell University  
Y-RISE, CEPR & STEG

MIT Sloan School of Business  
BREAD, J-PAL & NBER

January, 2021

# Introduction

Mechanization is a primary feature of modern agriculture.

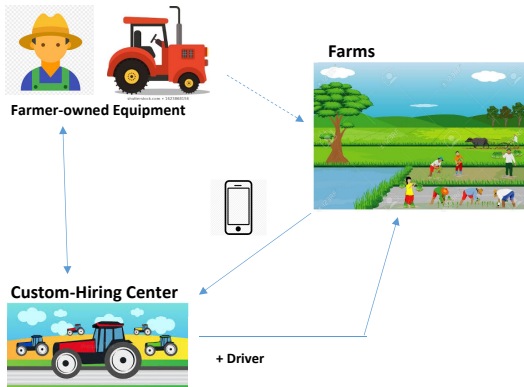
- *Significant automation technology,*
- *Increasing government subsidies aiming at increased mechanization.*

How does mechanization impact rural economies?

- *labor displacement effect,*
- *total factor productivity,*
- *farming households' income,*
- *marginal returns to mechanization?*

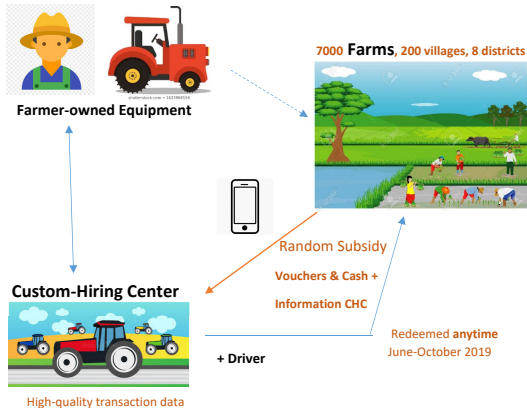
# Rental market and our intervention

Karnataka, India



# Rental market and our intervention

Karnataka, India



## Estimating equation

$$y_i = \alpha + \beta \mathbb{1}[\text{Mechanization Voucher}_i] + \\ + \gamma \mathbb{1}[\text{Mechanization Voucher and Cash}_i] + \psi_1 y_{ib} + \psi_2 X_i + \epsilon_i$$

$y_i$  outcome for farmer  $i$ .

$\beta$  impact of the subsidy.

$\gamma$  impact of **additional** cash transfer.

$y_{ib}$  baseline controls (when available).

Not finding spillovers, we pool and include village fixed effects.

# Mechanization for land-preparation

Voucher induces 1 additional hour of mech. relative to control.

	(1)	(2)
	IHS (Mechanization Index)	
1(Mechanization)	0.151*** (0.0326)	0.152*** (0.0406)
1(Cash and Mechanization)		0.00156 (0.0411)
Control Mean	-0.05 (6.8 hs)	-0.05 (6.8 hs)
Observations	5398	5360

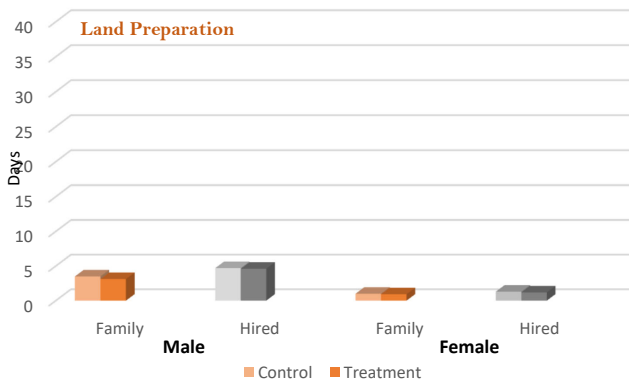
Standard errors clustered at the village-level in parentheses.

\*  $p < 0.10$ , \*\*  $p < 0.05$ , \*\*\*  $p < 0.01$ , \*\*\*\*  $p < 0.001$

less than 3% of the sample reports mechanizing other stages and we find no significant treatment effects.

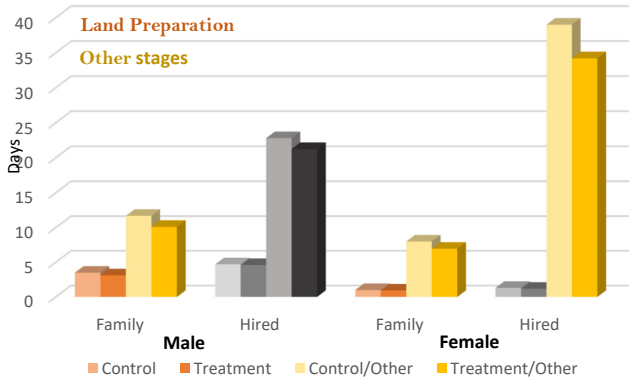
# Differential labor effects

Family labor savings at preparation, 1 day of work.



# Differential labor effects

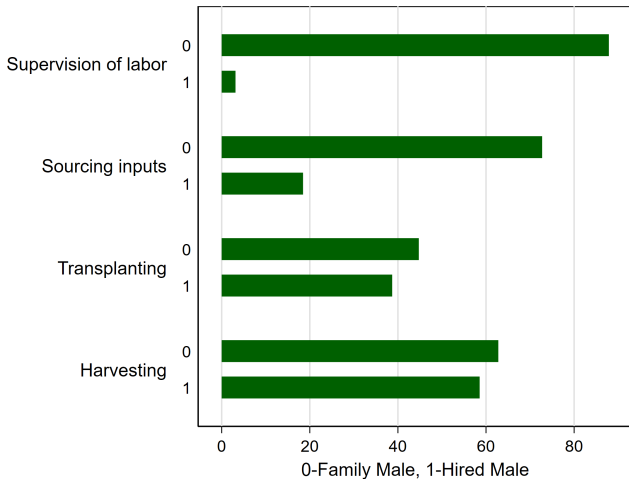
Hired labor savings later stages, 5 days of work.





# Task Specialization

Family labor savings concentrated in members involved in supervision.



Detailed task information for 14,000 workers.

# Non-agricultural income


Additional non-agricultural income worth season agric. wage.

	(1) 1(Any Non-Agricultural Income)	(2) Change in IHS (Non-Agricultural Income)
1(Mechanization)	0.0183 (0.0147)	0.464** (0.207)
1(Cash and Mechanization)	-0.00207 (0.0168)	-0.0144 (0.239)
Control Mean Levels	0.310	533.7
Observations	5497	5409

Standard errors clustered at the village-level in parentheses.

\*  $p < 0.10$ , \*\*  $p < 0.05$ , \*\*\*  $p < 0.01$ , \*\*\*\*  $p < 0.001$

## Implications:

Model of farming and mechanization to... 

- estimate the **importance of channels**,
  - *comparative advantage* of capital to labor across tasks.
  - *work on the farm, outside, hire labor and supervise.*
  - *size (and change) of the contracting friction* for hired labor.
- quantify **returns to mechanization**,

# Conclusion

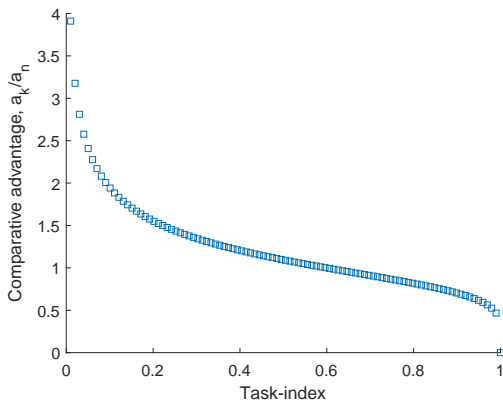
- Findings
  - returns to mechanizable tasks, 36%.
  - no changes in output/profits per acre.
  - returns to the subsidy, 28%.(income + input savings)
- Causal (short-run) impact of mechanization on labor and productivity.
- Task specialization → heterogeneous impacts on labor.

heterogeneous effects,  
general equilibrium.

# A model of farming

- Tasks  $x_i$ , performed with either capital or labor

$$x_i = a_k(i)k(i) + a_n(i)n(i).$$



## Returns to mechanization?

$$\ln y = \ln TFP + \alpha I \ln(k) + \text{labor} + \text{land} + \text{other inputs}$$

- RCT impacts TFP  $\rightarrow$  can't use treatment as IV  $\alpha I$

## Returns to mechanization?

$$\ln y = \ln TFP + \alpha I \ln(k) + \text{labor} + \text{land} + \text{other inputs}$$

- RCT impacts TFP  $\rightarrow$  can't use treatment as IV  $\alpha I$
- Parameters of interest:

Returns to mechanizable tasks  $\alpha$

Total Factor Productivity.

Capital-Labor elasticity of substitution.

## Returns to mechanization?

$$\ln y = \ln TFP + \alpha I \ln(k) + \text{labor} + \text{land} + \text{other inputs}$$

- RCT impacts TFP  $\rightarrow$  can't use treatment as IV  $\alpha I$
- Parameters of interest:

Returns to mechanizable tasks  $\alpha = 36\%$ .

Total Factor Productivity.

Capital-Labor elasticity of substitution.



# Bench-marking to Census

Census of over 41,000 farmers in 150 villages

	Intervention Sample		Census Sample	
	Mean	SD	Mean	SD
Land holdings (Acres)	3.56	2.8	3.78	4.8
Agricultural Revenue (000s)	48.435	86.48	48.209	74.07
1(Paddy)	.19	0.4	.2	.42
1(Cotton)	0.22	0.42	.23	.42
1(Maize)	0.16	0.37	0.17	0.38
Household Size	3.5	1.42	4.83	2.3
1(Commonly Rented Equipment)	0.94	0.24	0.85	0.35

Commonly rented implements: cultivator, rovatator, tractor, mechanical plough, disc plough, power tiller.

## Take-Up

- Mechanization in CHC increases by 30%.
- Identical for endline sample and entire sample.

	(1)	(2)	(3)	(4)
		1(Matched to Platform)		
1(Mechanization)	0.310*** (19.00)	0.338*** (18.66)	0.307*** (16.98)	0.335*** (16.53)
1(Cash and Mechanization)		-0.0569*** (-3.60)		-0.0576*** (-3.47)
Endline Survey			X	X
Observations	7202	7161	5530	5492

*t* statistics in parentheses. Clustering at the village-level.

\*  $p < 0.10$ , \*\*  $p < 0.05$ , \*\*\*  $p < 0.01$ , \*\*\*\*  $p < 0.001$

## Contracting frictions

- Workers' effort not contractible. Benefit from shirking,  $\omega w_s$ .
- Family labor supervises and detects shirking w/prob.  $\frac{n_f}{n_s}$ .
- Incentive compatibility yields,

$$w_s \geq \omega w_s + \left(1 - \frac{n_f}{n_s}\right) w_s,$$

assume  $\frac{n_f}{n_s} \leq 1$ .

- The optimal family supervision effort

$$\frac{n_f}{n_s} = \omega$$

- Optimality for family labor and hired labor imply

$$\omega = \frac{\alpha_f w_s}{\alpha w_f}$$

→ wage differential proportional to incentives to shirk!