

# Financial Frictions, Market Access, and Technology Adoption: Experimental Evidence from India

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December 15th 2023, Lucknow

# Partnership and Donors

The result of close **collaboration**:

- ▶ PANI
- ▶ PEHAL FOUNDATION
- ▶ IFMR

And generous **donors**:

- ▶ Economic and Social Research Council
- ▶ British Academy/Leverhume Trust
- ▶ CAHSS Global Challenges Fund
- ▶ Scottish Institute for Research in Economics
- ▶ University of Edinburgh, Kings College London, and Birkbeck University of London



# Motivation

- ▶ The majority of the world's poor live in rural areas and depend on **agriculture** for their livelihood.
- ▶ There have been many **technological advancements** in recent decades.
- ▶ **Adoption** of successful new models have varied widely.

# Motivation

- ▶ Since 2013, PANI has been trialling a multi-layered vegetable farming model called [Machan](#).
- ▶ Pilot studies on experimental farms have shown this to be highly successful at generating farm profits.
- ▶ Yet there are significant [obstacles to its widespread adoption](#).
  - ▶ Financial constraints
  - ▶ Access to markets

# Motivation

- ▶ **Question:** Does alleviating financial frictions and providing access to markets encourage adoption of new technology?

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- ▶ **Question:** Does alleviating financial frictions and providing access to markets encourage adoption of new technology?
- ▶ To answer this, we carried out a [randomised control trial](#) evaluating the effect of access to finance and markets on the adoption of Machan farming.

# Machan farming



# Machan farming

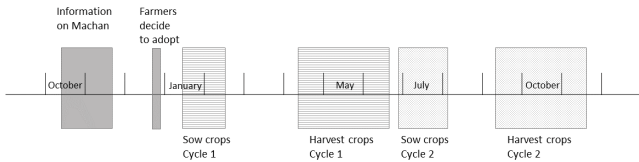




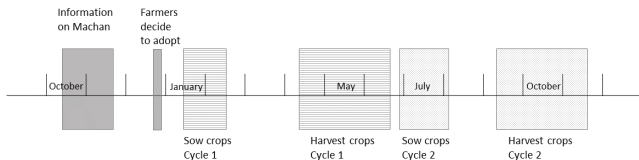
# Machan farming



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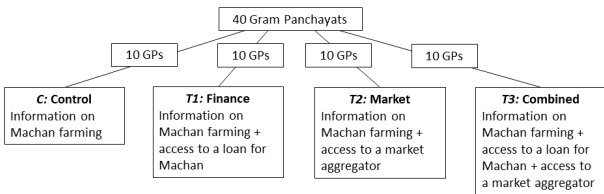
# Machan farming



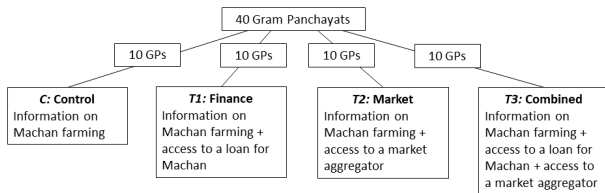
This multi-layered cropping cycle has three key advantages:

- ▶ Increase **land productivity**
- ▶ **Diversification** of crops
- ▶ Smooth **income** over the year

# Experimental design

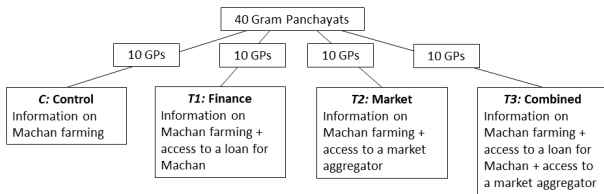


# Experimental design



Why choose a [randomised control trial](#)?

# Experimental design



Why choose a [randomised control trial](#)?

- ▶ Instead compare before and after?
  - ▶ An increase in adoption may just be a reflection of better economic times.

# Interventions

Information on **Machan** was provided by **PANI** and included:

- ▶ Orientation meeting
- ▶ Three videos on how to successfully implement Machan farming
- ▶ Demonstration plot and technical assistance



# Interventions

A **loan** for Machan was developed and promoted by **PAHEL**:

- ▶ Machan farmer
- ▶ Rs.10,000-Rs.30,000
- ▶ 12 months
- ▶ 24% interest repaid monthly
- ▶ Aadhar card + 2 pictures
- ▶ References from the community

**agritech** Machan Loan

Loan Values		Name of beneficiary:	Loan Summary	
Loan amount	₹ 30,000.00	Spouse Name:	Monthly payment	₹ 2,836.79
Annual interest rate	24.00%	Address:	Number of payments	12
Loan period in years	1	Mobile No.:	Total interest	₹ 4,041.45
Start date of loan	19/02/2021	Bank Account No.:	Total cost of loan	₹ 34,041.45
		Branch Address:		
		IFSC Code:		

Prnt No.	Payment Date	Beginning Balance	Payment	Principal	Interest	Ending Balance
1	19/03/2021	₹30,000.00	₹2,836.79	₹2,236.79	₹600.00	₹27,763.21
2	19/04/2021	₹27,763.21	₹2,836.79	₹2,281.52	₹555.26	₹25,481.69
3	19/05/2021	₹25,481.69	₹2,836.79	₹2,327.15	₹509.63	₹23,154.53
4	19/06/2021	₹23,154.53	₹2,836.79	₹2,373.70	₹463.09	₹20,780.84
5	19/07/2021	₹20,780.84	₹2,836.79	₹2,421.17	₹415.62	₹18,359.67
6	19/08/2021	₹18,359.67	₹2,836.79	₹2,469.59	₹367.19	₹15,890.07
7	19/09/2021	₹15,890.07	₹2,836.79	₹2,518.99	₹317.80	₹13,371.08
8	19/10/2021	₹13,371.08	₹2,836.79	₹2,569.37	₹267.42	₹10,801.72
9	19/11/2021	₹10,801.72	₹2,836.79	₹2,620.75	₹216.03	₹8,180.97
10	19/12/2021	₹8,180.97	₹2,836.79	₹2,673.17	₹163.62	₹5,507.80
11	19/01/2022	₹5,507.80	₹2,836.79	₹2,726.63	₹110.16	₹2,781.16
12	19/02/2022	₹2,781.16	₹2,836.79	₹2,781.16	₹55.62	₹0.00



# Interventions

A [market aggregator](#) for Machan was provided by [PANI](#):

- ▶ Two aggregators are identified by joint consensus
- ▶ The aggregator should be from the GP, young, literate, familiar with vegetable farming and selling at Mandis
- ▶ The role of the aggregator is to:
  - ▶ Collect information on farmers and their harvesting schedule, as well as on price of vegetables in all nearby Mandis
  - ▶ Inform farmers on market price and costs
  - ▶ If farmer wants to sell, coordinate the transport and sales at local Mandi

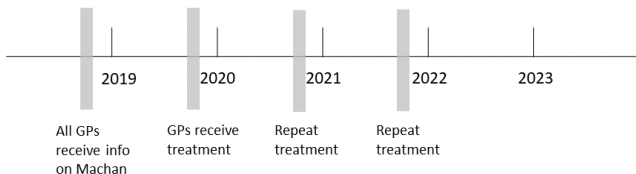


# Sampling

- ▶ The study was implemented across **40 GPs** in Rehra Bazaar block, Balrampur District, Uttar Pradesh.
- ▶ In each GP, PANI conducted a listing of all **farmers eligible for Machan** promotion based on:
  - ▶ Suitability of land
  - ▶ Total land area cultivated
  - ▶ Experience farming vegetables
  - ▶ Availability of family labour
- ▶ **4144 farming households** were identified by PANI (approximately 100 per GP).

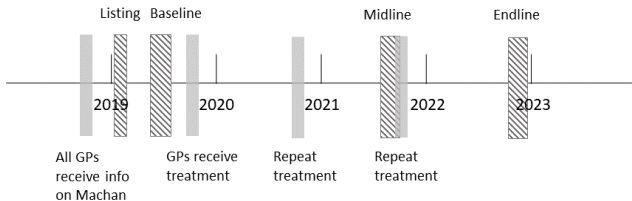
# Timeline

The experiment was implemented over **three consecutive years**.



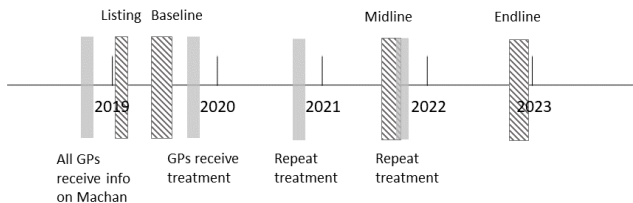
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- ▶ Pre-intervention **baseline** survey on household demographics and respondent characteristics.
- ▶ **Midline** survey on adoption in 2020 and 2021.
- ▶ Comprehensive **endline** survey on farming practices.

# Treatment effect

We estimate the **effect** of each treatment intervention compared to the **control**.

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- ▶ Ensure correct implementation of the experimental design:
  - ▶ Balance of sample
  - ▶ Awareness of interventions
- ▶ Control for the effect of **Covid-19** on the price of inputs.



# Sample characteristics and balance

	C: Control (1)	T1: Finance (2)	T2: Market (3)	T3: Combined (4)	N	p-value (5)
<b>Panel A: Respondent</b>						
HH head ( <i>binary</i> )	0.633	0.611	0.637	0.619	4144	0.79
Male ( <i>binary</i> )	0.758	0.733	0.757	0.746	4144	0.68
Age ( <i>binary</i> )	45.769	45.031	45.258	45.284	4144	0.86
Completed primary school ( <i>binary</i> )	0.461	0.511	0.534	0.563	3824	0.15
Main occupation is farming ( <i>binary</i> )	0.853	0.867	0.858	0.866	4144	0.94
Attitude to risk ( <i>index</i> , 1-3)	1.092	1.097	1.102	1.110	3499	0.83
<b>Panel B: Household</b>						
Number of members ( <i>nb</i> )	6.957	6.935	7.103	6.912	4144	0.77
Asset ownership ( <i>index</i> , 0-14)	4.350	4.632	4.624	4.810	3824	0.18
Solid house ( <i>binary</i> )	0.873	0.888	0.910	0.917	3824	0.17

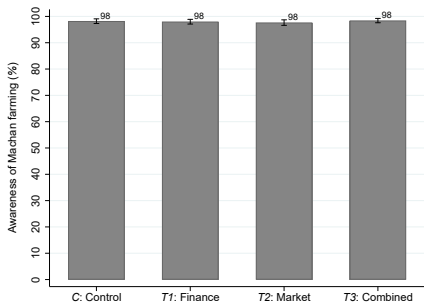
# Sample characteristics and balance

	C: Control (1)	T1: Finance (2)	T2: Market (3)	T3: Combined (4)	N	p-value (5)
<b>Panel C: Farming</b>						
Land area cultivated ( <i>ha</i> )	1.533	1.603	1.809	1.746	3488	0.20
Mechanised equipment ( <i>binary</i> )	0.071	0.086	0.098	0.106	3824	0.36
Rice-Wheat cropping ( <i>binary</i> )	0.524	0.517	0.481	0.506	3824	0.94
<b>Panel D: Machan</b>						
Know of PANI ( <i>binary</i> )	0.591	0.628	0.578	0.627	4144	0.90
Know of Machan ( <i>binary</i> )	0.823	0.844	0.829	0.875	4144	0.66
Does Machan farming ( <i>binary</i> )	0.056	0.071	0.077	0.094	4142	0.28

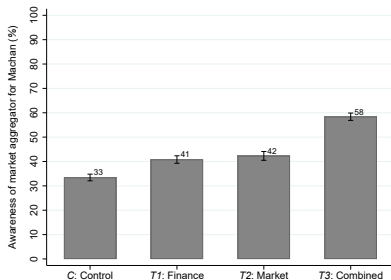
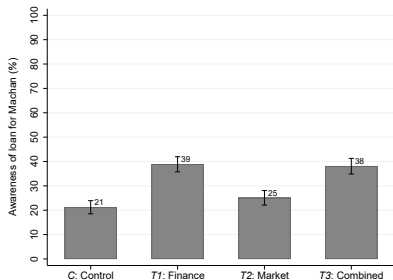
# Awareness of the interventions

Source of information on Machan were:

1. PANI
2. Network of farmers



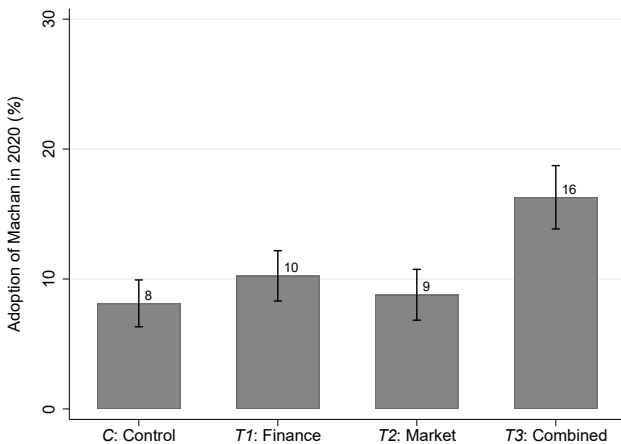
# Awareness of the interventions



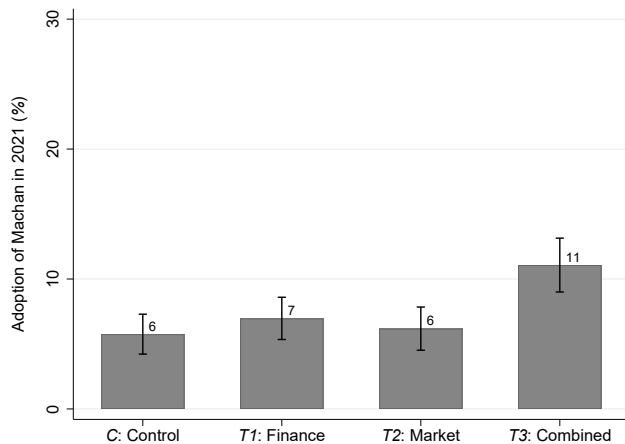
# Effect of Covid-19

	C: Control (1)	T1: Finance (2)	T2: Market (3)	T3: Combined (4)	N	p-value (5)
Panel A: Covid-19 Wave 1 (2020)						
Price of fertiliser increased ( <i>binary</i> )	0.564	0.578	0.528	0.655	3527	0.14
Increase in the price of fertiliser (%)	10.028	9.385	8.931	11.345	3527	0.08
Price of seeds increased ( <i>binary</i> )	0.472	0.518	0.455	0.536	3527	0.58
Increase in the price of seeds (%)	7.327	7.818	6.522	8.687	3527	0.27
Price of irrigation increased ( <i>binary</i> )	0.277	0.405	0.333	0.418	3527	0.04
Increase in the price of irrigation (%)	4.483	6.393	4.381	7.347	3527	0.10
Price of labour increased ( <i>binary</i> )	0.133	0.215	0.085	0.180	3527	0.02
Increase in the price of labour (%)	2.767	3.728	1.533	3.715	3527	0.03

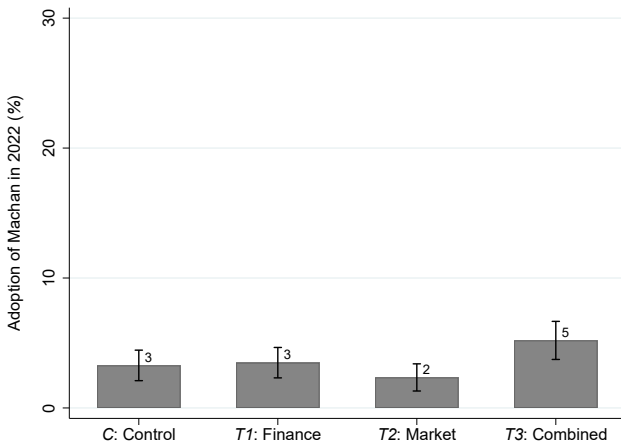
# Adoption of Machan - Year 1



## Adoption of Machan - Year 2



## Adoption of Machan - Year 3





## Adoption of Machan

- ▶ The combined treatment of [access to finance and markets](#) has the largest effect.
  - ▶ [Double the adoption rate compared to the control](#)
- ▶ Dis-adoption of the technology over time.
- ▶ Robustness of estimates to varying data measures and estimation process.

## Reasons for dis-adoption of Machan

1. Crop loss due to pest/animal => 62%
2. Lack of labour => 37%
3. Lack of available land => 25%
4. Do not understand the technology => 8%
5. Expensive => 4%
6. Access to markets => 1%

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## Characteristics of Machan farmers

	Adopter (1)	N	Non-Adopter (2)	N	p-value (3)
<b>Panel A: Respondent</b>					
HH head ( <i>binary</i> )	0.690	429	0.617	3715	0.00
Male ( <i>binary</i> )	0.823	429	0.739	3715	0.00
Age ( <i>binary</i> )	44.441	429	45.433	3715	0.21
Completed primary school ( <i>binary</i> )	0.620	361	0.506	3463	0.00
Main occupation is farming ( <i>binary</i> )	0.886	429	0.858	3715	0.09
Attitude to risk ( <i>index, 1-3</i> )	1.131	335	1.097	3164	0.19
<b>Panel B: Household</b>					
Number of members ( <i>nb</i> )	7.790	428	6.897	3713	0.00
Asset ownership ( <i>index, 0-14</i> )	5.000	361	4.563	3463	0.00
Solid house ( <i>binary</i> )	0.892	361	0.897	3463	0.79

Machan farmers are: more likely to be **educated** with **farming** as their main occupation, from **larger households** with more **assets**.

## Characteristics of Machan farmers

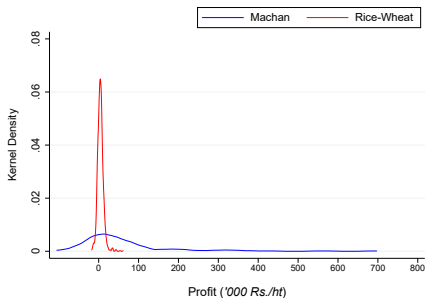
	Adopter (1)	N	Non-Adopter (2)	N	p-value (3)
<b>Panel C: Farming</b>					
Land area cultivated ( <i>ha</i> )	2.216	314	1.559	2853	0.00
Owns mechanised equipment ( <i>binary</i> )	0.136	361	0.085	3463	0.01
Rice-Wheat cropping ( <i>binary</i> )	0.460	361	0.513	3463	0.04
<b>Panel D: Machan</b>					
Know of PANI ( <i>binary</i> )	0.758	429	0.590	3715	0.00
Know of Machan ( <i>binary</i> )	0.893	429	0.838	3715	0.00
Does Machan farming ( <i>binary</i> )	0.242	429	0.055	3713	0.00

Machan farmers are: more likely to have more **land** and less dependent on **rice-wheat** cropping. They are more likely to know of **PANI** and previous experience with **Machan**.

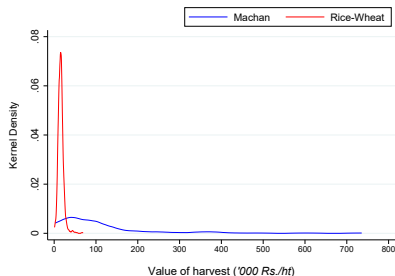
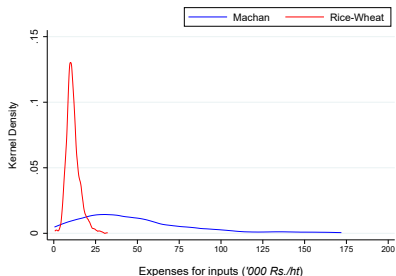
# Comparing Machan with Rice-Wheat cropping

## Machan farming:

- ▶ Can be very profitable
- ▶ Huge variability



# Comparing Machan with Rice-Wheat cropping





# Conclusion

- ▶ Providing **access to finance and markets** has alleviated some **constraints** faced by potential Machan farmers.
- ▶ Machan farming has the potential to be profitable.
- ▶ There remains significant barriers to adoption:
  - ▶ **Crop loss** from pest/animal/weather conditions

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- ▶ There remains significant barriers to adoption:
  - ▶ **Crop loss** from pest/animal/weather conditions
- ▶ A potential intervention to address this would be:
  - ▶ **Crop insurance** to cover vegetables

