

# Risk and the modernization of agriculture

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# Two mechanisms through which risk of extreme weather events affects farmers

- ① Direct costs through damages to crops, homes, livestock, etc.
- ② Self-insurance - conservative decisions that reduce risk at expense of lower profitability (Binswanger and Rosenzweig, 1993; Morduch, 1995)
  - Crop / variety choice
  - Level of input use
  - Management techniques (i.e. how to plant)

## Our question focuses on the second mechanism

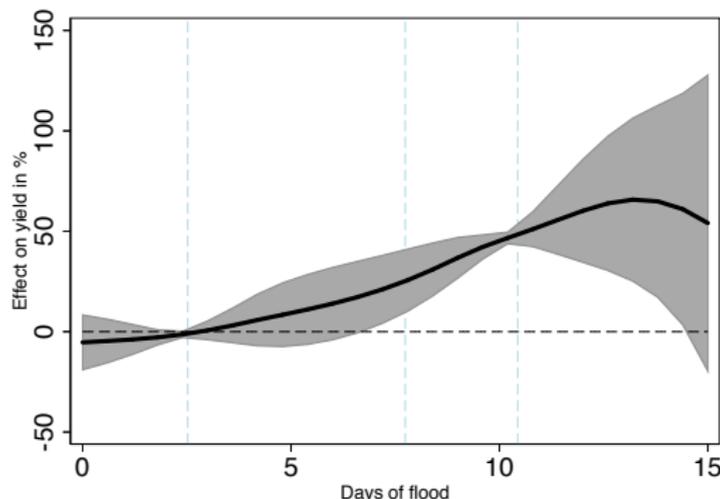
- *Question:* Can new technologies that make agricultural output less susceptible to weather extremes crowd in investments that were previously too risky?
  - If so, technologies can boost agricultural output **in normal years**

# Approach

- ① Two year field experiment in 128 villages of Odisha India
- ② Allocate 5kg of flood-tolerant rice seeds “Swarna-Sub1” to a random subset of farmers (5 farmers in each of 64 villages)
- ③ Large floods occurred in many villages during year 1 (2011)  
Farmers misfortune = Experimenter’s luck:
  - **Verify the agronomic properties of Swarna-Sub1**
- ④ Observe changes in behavior in year 2 (2012)  
Normal rainfall: Farmers’ good luck = Experimenter’s good luck
  - **Large changes in investment, but also in savings and credit use**
  - **Large aggregate effect on yield and on production**
  - **Because there was no flood, aggregate effect on production solely due to behavioral change**

# Agronomic value measured in year 1

- Swarna-Sub1: A flood-tolerant rice variety
  - Similar to Swarna, a common variety used throughout eastern India
  - Enhanced flood tolerance, especially for 5-14 days of flood
  - Similar yield without flooding
- Technology increases expected yield and reduces variance
  - Also pro-poor due to higher flood exposure for low caste (long historical marginalization toward less favorable lands)



Source: Dar et al. (2013)

# Sub1 works by suppressing elongation response



# Theoretical framework

- Model
  - Standard multiperiod household model
  - Production is risky (flood/ no-flood after input choices)
  - Return to inputs lower under flood conditions
  - Modern technology increases return to inputs under flood, no difference under normal conditions, i.e., protection under downward risk with no penalty.
- Predictions
  - [Productivity effect] Technology increases *expected return* to inputs  
→ increases investment in inputs.
  - [Insurance effect] Technology reduces losses in bad states  
→ allows to reduce risk mitigation behavior and precautionary savings.  
Effect  $\uparrow$  with risk aversion

# All specifications are ITT

- Either at the farmer or plot level:

$$y_{ivb} = \beta_0 + \beta_1 treatment_{ivb} + x_{ivb}\delta + \alpha_b + \varepsilon_{ivb}$$

$$y_{ipvb} = \beta_0 + \beta_1 treatment_{ivb} + x_{ivb}\delta + \alpha_b + \varepsilon_{ipvb}$$

- $i$  is farmer,  $p$  is plot,  $v$  is village, and  $b$  is block (strata)
- SE's clustered at village level
- 25% of farmers dis-adopted during year 2, 10% adopted from peers.

**ITT results robust to dropping non-recipients in treatment villages**

- **Inputs / Management Practices**

- Rice area
- Fertilizer use, concentrated on fertilizers used earlier in growing season
- Use of “traditional varieties”
- Planting method

- **Yield in kg per ha**

- **Credit**

- **Precautionary savings**

# Flood tolerance increases area cultivated

	(1) Number plots	(2) Rice area	(3) Log rice area
Original minikit recipient	0.675*** (0.125)	0.102* (0.055)	0.090** (0.044)
ST or SC	-0.252 (0.156)	-0.032 (0.052)	-0.048 (0.055)
HH has BPL card	-0.001 (0.115)	-0.147*** (0.051)	-0.105** (0.045)
HH has thatched roof	-0.391*** (0.119)	-0.208*** (0.052)	-0.207*** (0.047)
Block Fixed Effects	Yes	Yes	Yes
Mean of Dep Variable	3.57	1.00	-0.20
Number of Observations	1235	1235	1173
R squared	0.112	0.136	0.186

# Flood tolerance increases use of “early” fertilizers

	(1)	(2)	(3)	(4)	(5)
	All	Latest Urea	Earliest DAP	Middle MOP	Gromor
Original minikit recipient	24.622** (10.002)	3.329 (4.235)	18.347*** (5.282)	5.940* (3.213)	-2.993 (2.637)
Rice area (hectares)	217.515*** (19.379)	86.801*** (13.401)	89.468*** (9.272)	32.445*** (7.027)	8.802*** (2.567)
Scheduled Tribes or Scheduled Castes	-17.964* (9.574)	-3.952 (3.748)	-5.363 (4.579)	-5.040* (2.947)	-3.609 (2.602)
HH has Below-Poverty- Line card	-1.348 (9.021)	-0.933 (4.041)	-4.993 (4.306)	1.480 (2.440)	3.098 (2.456)
HH has thatched roof	-18.801** (8.400)	-7.489** (3.572)	0.247 (4.502)	-6.292** (2.653)	-5.267** (2.481)
Block Fixed Effects	Yes	Yes	Yes	Yes	Yes
Mean of Dep Variable (kg)	215.49	83.33	79.99	37.15	15.01
Number of Observations	1235	1235	1235	1235	1235
R squared	0.615	0.508	0.518	0.288	0.074

## Aside: “Traditional varieties” less likely to die during flood

- Traditional seed varieties are pre Green Revolution
- Low yield, but often less risk of failure

# Aside: Transplanting rice vs. broadcasting

Labor intensive transplanting



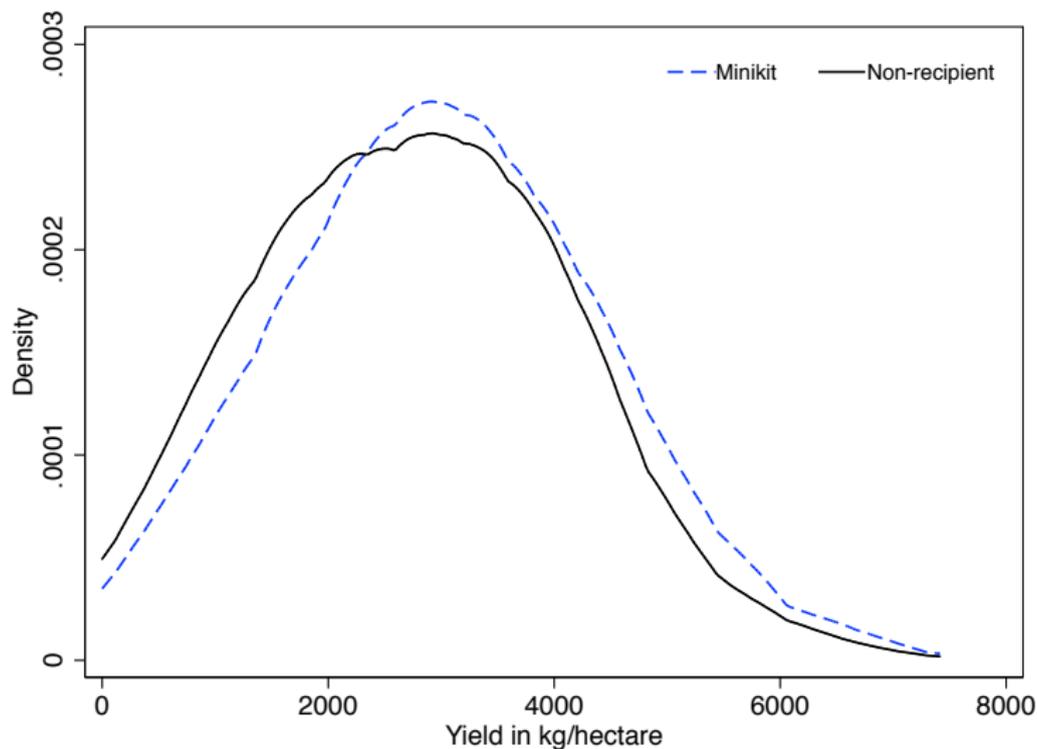
Low yielding broadcasting



# Flood tolerance induces risk-taking

	(1)	(2)	(3)	(4)	(5)
	Use Swarna	Use TV	Broadcast	Irrigated	Not cult.
Original minikit recipient	-0.102*** (0.017)	-0.041** (0.016)	-0.063*** (0.017)	0.036 (0.029)	-0.023* (0.012)
ST or SC	0.041 (0.025)	-0.008 (0.022)	-0.029 (0.028)	-0.031 (0.041)	-0.013 (0.016)
HH has thatched roof	-0.020 (0.017)	0.023 (0.019)	0.009 (0.023)	0.025 (0.028)	0.004 (0.013)
HH has BPL card	-0.020 (0.018)	0.013 (0.020)	0.020 (0.021)	-0.026 (0.029)	-0.006 (0.013)
Block Fixed Effects	Yes	Yes	Yes	Yes	Yes
Mean of Dep Variable	0.36	0.28	0.19	0.74	0.08
Number of Observations	4578	4577	4571	4546	5057
R squared	0.116	0.270	0.243	0.080	0.020

Effect on average productivity is 283 kg per ha, or 10%



# Flood tolerance crowds in agricultural credit

	Has credit		
	(1) All	(2) Early	(3) Late
Original minikit recipient	0.068** (0.027)	0.054** (0.025)	0.017 (0.017)
ST or SC	-0.048** (0.023)	-0.050** (0.024)	0.008 (0.020)
HH has BPL card	-0.032 (0.024)	-0.013 (0.022)	-0.016 (0.015)
HH has thatched roof	-0.014 (0.024)	-0.032 (0.022)	0.018 (0.014)
Block Fixed Effects	Yes	Yes	Yes
Mean of Dep Variable	0.19	0.14	0.05
Number of Observations	1235	1235	1235
R squared	0.063	0.062	0.028

# Flood tolerance crowds out precautionary savings

	Share saved		Log KG saved	
	(1)	(2)	(3)	(4)
Original minikit recipient	-0.050*** (0.017)	-0.087*** (0.026)	-0.045 (0.032)	-0.102** (0.046)
HH has BPL card	-0.001 (0.018)	-0.018 (0.020)	-0.026 (0.026)	-0.053* (0.028)
Original minikit recipient*HH has BPL card		0.067** (0.030)		0.102* (0.054)
Log total harvest			0.771*** (0.018)	0.772*** (0.018)
Block Fixed Effects	Yes	Yes	Yes	Yes
Mean of Dep Variable	0.70	0.70	7.16	7.16
Number of Observations	1165	1165	1153	1153
R squared	0.073	0.077	0.792	0.792

# Combined, results suggest risk strongly influences decisions

Effects measured during year 2 (normal year following a bad year):

- **Inputs / Management Practices**

- 10% increase in rice area
  - 11% increase in fertilizer use, concentrated on fertilizers used earlier in growing season
  - 15% less reliance on low return, low risk “traditional varieties”
  - 33% less use of “broadcast” planting method vs. more costly transplanting
- Approx 10% increase in yield

- **Precautionary Savings:** 5 pp less savings of output for future consumption

- **Credit:** 36% increase in credit use

# Main explanation is that reduction in risk drives results

But, other explanations are possible:

① Increased expected return

Swarna-Sub1 reduces exposure to downward risk without penalty in good years

→ increases expected return *and* reduces risk

Both effects can be responsible for:

- Increased investment in inputs, both extensive and intensive margins  
→ increase in yield and in production
- Increased in credit
- Reduction in share of production saved

Can we distinguish these two effects?

# Main explanation is that reduction in risk drives results

What reveals the role of risk reduction versus increase in expected return?

- Fertilizer effects concentrated on fertilizers applied early in the season  
Early and late fertilizers are mildly complementary  
So any difference is due to decrease in risk during the growing season
- Land brought into production is low quality land, and land more prone to flood
- Results are generally larger for most risk averse farmers
- Share of production that is saved is lower *at any given level of production*
  
- Unlikely to be about production function b/c effects persist even on non-Sub1 plots

# Main explanation is that reduction in risk drives results

Two other potential explanations:

## ① Wealth effects

Could increased production during year 1 drive results?

Unlikely because:

- Only small amount of seed during year 1
  - Small aggregate income effects
- Conditioning on year 1 harvest does not change results

## ② Output prices

Unlikely because:

- Output price of Swarna-Sub1 higher than Swarna by 4.6%.
- But, only 40% of farmers sold any output at all
- Results are similar for sub-sample that did not sell output

# Conclusions

- Risk reduction through weather resilient technology helps:
  - Cope with shocks in bad years
  - Reduce risk management/self-insurance in normal years
- Average gain in normal years from risk management (283kg) about equal to average avoided losses in bad years from shock coping (250kg)
- If there are more normal than bad years, risk management gains (behavioral spillover effects) exceed gains from shock coping (agronomic intended purpose) in expected value