

# **Underinvestment in a Profitable Technology: The Case of Seasonal Migration in Bangladesh**

*Research by*

Gharad Bryan, Shyamal Chowdhury, and Ahmed Mushfiq Mubarak (2014)

*Presentation by*

Sajid Al Sanai

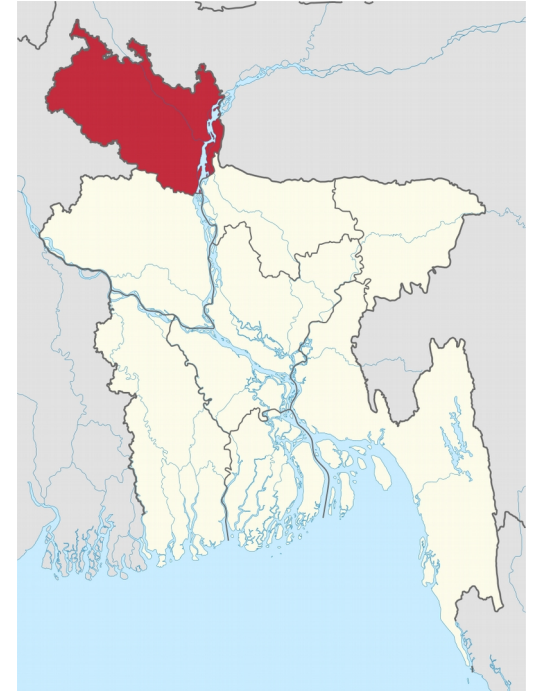
University of Washington

# Outline

- Context
- Research Question
- Experiment Design
- Estimation and Results
- Model
- Findings

# Bangladesh

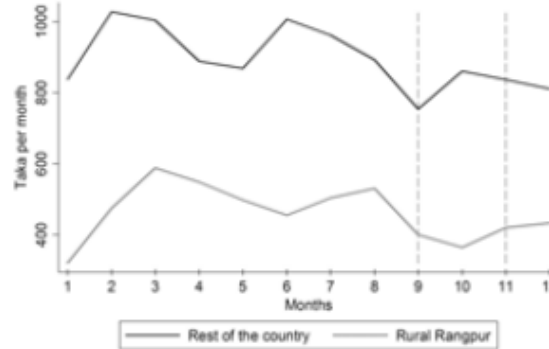
- Bangladesh is subdivided (in order of precedence) into:
  - Divisions, districts, sub-districts, and villages
- Rangpur is a division lying in northwest of country
- Accounts for 7% (9.6 million) of national population
- 5.3 million (57%) of people live below the poverty line
- Experiences higher rates of poverty compared to rest of country
- Must regularly cope with pre-harvest seasonal famine known as *monga*



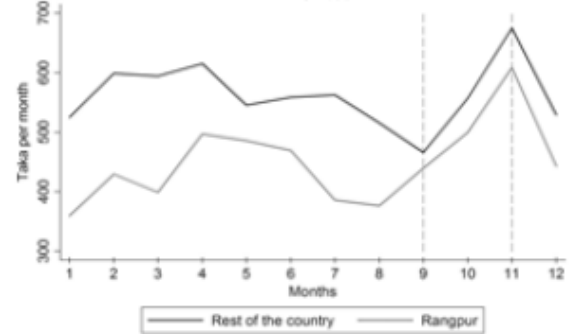
- *Monga* occurs during post-planting and pre-harvest between September-November
- *Amman* rice (staple crop) harvest occurs in December
- Employment opportunities scarce during *monga* in largely agrarian areas
- Similar lean seasons experienced widely throughout South Asia and Sub-Saharan Africa
- During *monga*, households exhibit seasonal patterns of income and spending
  - Seasonality most pronounced in Rangpur out of all divisions in Bangladesh
  - Total household incomes p.c. decrease by 50-60%
  - Total household expenditures p.c. decrease by 15-20%
- Source: HIES (2005)

- Rice prices highly linked to food expenditure p.c. (staple)
- Rice prices rise, with diminishing incomes
- Households while facing higher food expenditure p.c., also reduce rice consumption by 22% in famine
- Erosion of purchasing power drives households below subsistence during *monga*
- Expected detrimental effects
- Source: HIES (2005)

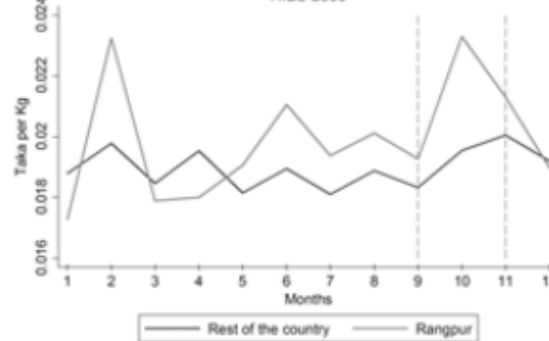
Panel A. Seasonality - Total Expenditures per Capita  
HIES 2000



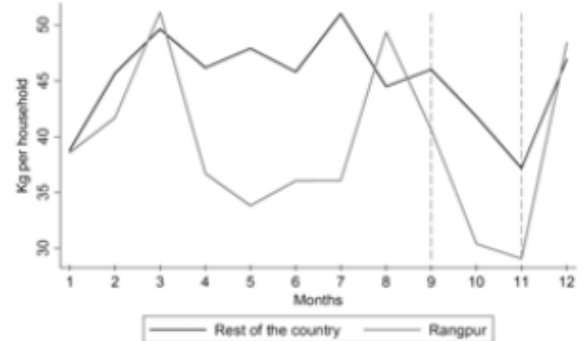
Panel B. Seasonality - Food Expenditure per Capita  
HIES 2005



Panel C. Seasonality - Price of Rice  
HIES 2005



Panel D. Seasonality - Quantity Rice per Household  
HIES 2005



- Question-driven research agenda
- Try to understand how a famine can occur annually despite existence of potential mitigation strategies, through the lens of migration
- Seasonal migration a primary mechanism households use to diversify income sources in India (Bannerjee and Duflo, 2007)
- Puzzle:
  - Seasonal out-migration from *monga*-prone districts in Rangpur low despite absence of local non-farm employment opportunities
  - Inter-regional variation in income and poverty between Rangpur and the rest of Bangladesh are much larger than inter-seasonal within variation
  - Suggests that potential inter-regional arbitrage opportunity for smoothing incomes exists through migration for employment

- Posit that out-migration to urban areas for employment is an underutilised technology
- Technology is developed through migration episodes with the underlying impact of developing networks and local knowledge et cetera
- Offers returns to investment from migratory employment through remittance to origin
- Migration outcomes are uncertain and households are risk-averse
- Fear high cost of failure which may be unlikely
- Posit that alternative technology adoption slow due to:
  - Individual-specific risk
  - Poverty vulnerability
- Leads to low levels of experimentation and diffusion of technologies
- Randomised intervention allowed researchers to generate first experimental estimates of the effects of migration (which they use to build a baseline model)

# Experiment Design

- In 2008, two most *monga*-prone districts in Rangpur chosen
  - Kurigram & Lalmonirhat
- From each district, randomly selected 100 villages
- Randomly selected 19 households in each village satisfying the following criteria:
  - Own <50 decimals of land
  - $\geq 1$  household member forced to miss meals in 2007 *monga* season
- 1900 households obtained
- Each of 100 villages are randomly assigned to control and treatment groups
- (19 households in each village all assigned to same group)



- Control – 16 villages
- Treatment
  - Incentivised
    - Cash – 37 villages
    - Credit – 31 villages
    - \$8.50 for ticket + \$3 on arrival claimed within x days of arrival
  - Non-incentivised
    - Information – 16 villages

# Timeline

- Baseline survey – July 2008
  - Experiment – August 2008
  - Consumption survey:
    - Dec 2008
    - May, Dec 2009
  - Migration survey:
    - Dec 2008
    - May, Dec 2009
    - Jul 2011
- Baseline survey
    - Household roster, characteristics, assets, economic activity, production, credit and savings use, consumption, expenditure, previous migration, migration expectations
  - Migration survey:
    - Migration episodes, employment, remittance
  - Consumption survey:
    - Assets, credit and savings use, economic activity, production, consumption, expenditure

# PROGRAM TAKE-UP RATES<sup>a</sup>

	<i>Incentivized</i>	Cash	Credit	<i>Not Incentivized</i>	Info	Control	<i>Diff. (I – NI)</i>
Migration rate in 2008	58.0% (1.4)	59.0% (1.9)	56.8% (2.1)	36.0% (2.0)	35.9% (2.8)	36.0% (2.8)	22.0*** (2.4)
Migration rate in 2009	46.7% (1.4)	44.6% (1.9)	49.1% (2.1)	37.5% (2.0)	34.4% (2.8)	40.5% (2.9)	9.2*** (2.5)
Migration rate in 2011 <sup>b</sup>	39% (2.1)			32% (2.5)			7.0** (3.3)

# Estimation

$$Y_{ij} = \alpha + \beta_1 \text{Cash}_{ij} + \beta_2 \text{Credit}_{ij} + \beta_3 \text{Information}_{ij} + \varphi_j + v_{ij},$$

EFFECTS OF MIGRATION BEFORE DECEMBER 2008 ON CONSUMPTION AMONGST REMAINING HOUSEHOLD MEMBERS<sup>a</sup>

	ITT			ITT	ITT	IV	IV	OLS
	Cash	Credit	Info					
Panel A: 2008 Consumption								
Consumption of food	61.876** (29.048)	50.044* (28.099)	15.644 (40.177)	48.642** (24.139)	44.183* (23.926)	280.792** (131.954)	260.139** (128.053)	102.714*** (17.147)
Consumption of non-food	34.885*** (13.111)	27.817** (12.425)	22.843 (17.551)	20.367** (9.662)	16.726* (9.098)	115.003** (56.692)	99.924* (51.688)	59.085*** (8.960)
Total consumption	96.566*** (34.610)	76.743** (33.646)	38.521 (50.975)	68.359** (30.593)	60.139** (29.683)	391.193** (169.431)	355.115** (158.835)	160.696*** (22.061)
Total calories (per person per day)	106.819* (62.974)	93.429 (59.597)	−85.977 (76.337)	142.629*** (47.196)	129.901*** (48.057)	842.673*** (248.510)	757.602*** (250.317)	317.495*** (41.110)

	ITT							
	Cash	Credit	Info	ITT	ITT	IV	IV	OLS
	Panel B: 2009 Consumption							
Consumption of food	34.273 (23.076)	22.645 (23.013)	−30.736 (29.087)	43.983** (17.589)	34.042* (18.110)	230.811** (100.536)	186.279* (96.993)	1.687 (14.687)
Consumption of non-food	3.792 (16.186)	31.328* (18.135)	−8.644 (20.024)	21.009* (11.954)	14.877 (12.031)	110.324* (65.333)	74.216 (63.792)	6.133 (10.312)
Total consumption	38.065 (30.728)	53.973 (34.057)	−39.380 (39.781)	64.992*** (23.958)	48.919* (24.713)	341.135** (137.029)	260.495** (131.851)	7.820 (21.044)
Total calories (per person per day)	83.242 (52.766)	23.995 (62.207)	−81.487 (60.141)	95.621** (39.187)	78.564* (40.600)	510.327** (221.010)	434.602** (216.670)	20.361 (28.392)
Controls?	No	No	No	No	Yes	No	Yes	No

# Estimation

$$Y_{ivj} = \alpha + \beta Migrant_{ivj} + \theta X_{ivj} + \varphi_j + v_{ivj},$$

$$Migrant_{ivj} = \lambda + \rho Z_v + \gamma X_{ivj} + \varphi_j + \varepsilon_{ivj},$$

EFFECTS OF MIGRATION BEFORE DECEMBER 2008 ON CONSUMPTION AMONGST REMAINING HOUSEHOLD MEMBERS<sup>a</sup>

	ITT							
	Cash	Credit	Info	ITT	ITT	IV	IV	OLS
	Panel A: 2008 Consumption							
Consumption of food	61.876** (29.048)	50.044* (28.099)	15.644 (40.177)	48.642** (24.139)	44.183* (23.926)	280.792** (131.954)	260.139** (128.053)	102.714*** (17.147)
Consumption of non-food	34.885*** (13.111)	27.817** (12.425)	22.843 (17.551)	20.367** (9.662)	16.726* (9.098)	115.003** (56.692)	99.924* (51.688)	59.085*** (8.960)
Total consumption	96.566*** (34.610)	76.743** (33.646)	38.521 (50.975)	68.359** (30.593)	60.139** (29.683)	391.193** (169.431)	355.115** (158.835)	160.696*** (22.061)
Total calories (per person per day)	106.819* (62.974)	93.429 (59.597)	−85.977 (76.337)	142.629*** (47.196)	129.901*** (48.057)	842.673*** (248.510)	757.602*** (250.317)	317.495*** (41.110)



	ITT							
	Cash	Credit	Info	ITT	ITT	IV	IV	OLS
	Panel B: 2009 Consumption							
Consumption of food	34.273 (23.076)	22.645 (23.013)	−30.736 (29.087)	43.983** (17.589)	34.042* (18.110)	230.811** (100.536)	186.279* (96.993)	1.687 (14.687)
Consumption of non-food	3.792 (16.186)	31.328* (18.135)	−8.644 (20.024)	21.009* (11.954)	14.877 (12.031)	110.324* (65.333)	74.216 (63.792)	6.133 (10.312)
Total consumption	38.065 (30.728)	53.973 (34.057)	−39.380 (39.781)	64.992*** (23.958)	48.919* (24.713)	341.135** (137.029)	260.495** (131.851)	7.820 (21.044)
Total calories (per person per day)	83.242 (52.766)	23.995 (62.207)	−81.487 (60.141)	95.621** (39.187)	78.564* (40.600)	510.327** (221.010)	434.602** (216.670)	20.361 (28.392)
Controls?	No	No	No	No	Yes	No	Yes	No

- Data of migrant's earnings (non-experimental) and savings collected at the destination
- Incentivised households earned BDT 7451 (~USD 100) on average during *monga* and saved half of it
- Non-incentivised groups earned higher, suggesting they are more experienced and have engaged in this activity prior to the newly induced

MIGRANT EARNINGS AND SAVINGS AT DESTINATION  
(DATA FOR MIGRANTS ONLY; NON-EXPERIMENTAL)<sup>a</sup>

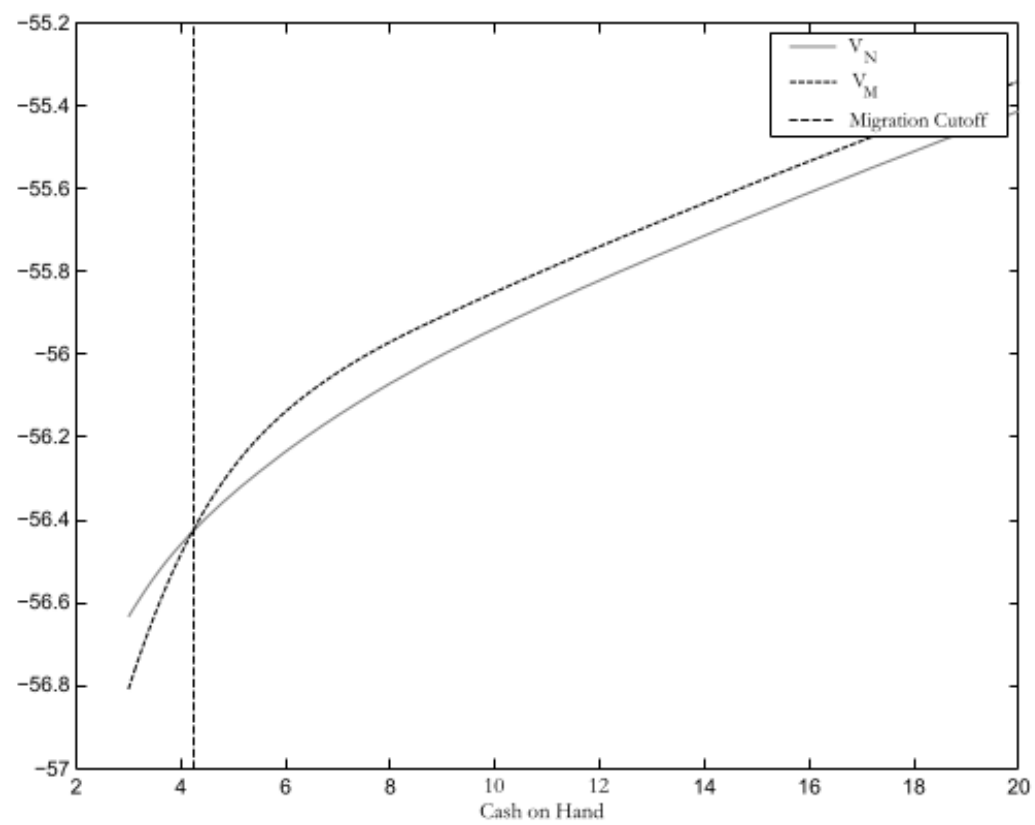
	All Migrants	Incentivized	Not Incentivized	Diff.
Total savings by household	3490.47 (97.22)	3506.59 (110.83)	3434.94 (202.80)	71.65 (232.91)
Total earnings by household	7777.19 (244.77)	7451.27 (264.99)	8894.40 (586.14)	-1443.129** (583.83)
Savings per day	56.76 (1.15)	56.46 (1.29)	57.79 (2.56)	-1.33 (2.77)
Earnings per day	99.39 (1.75)	96.09 (1.92)	111.15 (4.0)	-15.06** (4.2)
Remittances per day	18.34 (1.06)	16.94 (1.19)	23.33 (2.28)	-6.39** (2.55)
One-way travel cost per episode	264.55 (3.41)	264.12 (3.80)	266.00 (7.62)	-1.88 (8.16)

# Model

$$B(x) = \max_{c \leq x} \left[ u(c) + \delta \int_S B(y_S + R(x - c)) d\mu(s) \right],$$

$$G(x) = \max_{c \leq x+m} \left[ u(c) + \delta \int_S G(y_S + R(x + m - c)) d\mu(s) \right].$$

$$V(x) = \max \left\{ \max_{c \leq x} \left[ u(c) + \delta \int_S V(y_s + R(x - c)) d\mu(s) \right], \right. \\ \left. \pi_G G(x) + (1 - \pi_G) B(x - F) \right\}.$$



- Calibration yields results that do not match data
  - Simulate for cutoff points for cash and credit
  - Overlay interval on distribution of consumption in control group
  - Region within interval is proportion of control group predicted as induced to migrate
- For risk aversion (1.5), estimates matched data
- However, only the case without forward-looking households and without savings
- (When households are assumed forward-looking and can save, risk aversion needed to be implausibly high to match data)

- Qualitative evaluation of model shows that
  - Risk
  - Subsistence
  - Learning / experience
- ... are important explanations of experimental findings

- Income variability found empirically is realised through draws of state-dependent  $y$ 
  - Absolute deviations of s.d. of consumption between surveys greatly differ
- Background risk motivates buffer stock savings
  - Given households are prudent and impatient, risk of income variability motivates households to engage in buffer stock savings
- Household perception is that migration is risky and behave as if risk averse
  - Experiment repeated in 2011 at time of survey with 33 additional villages
  - Control, Conditional Credit, Unconditional Credit, and Conditional Credit with Bogra Rainfall Insurance



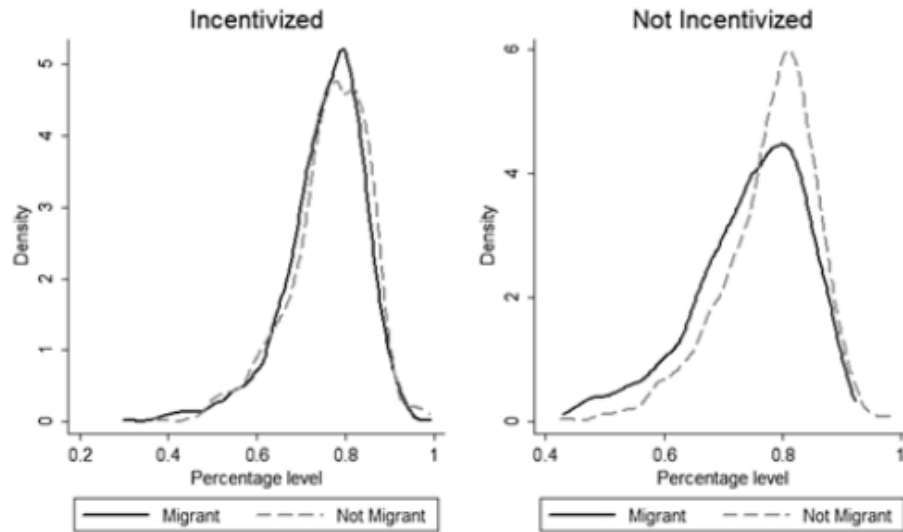
- Excessive rainfall limits employment at destination in rickshaw transport and construction
- The higher the rainfall, the less this treatment group would repay
- If little to no rainfall, the treatment group pays an additional premium
- Basis risk: Probability that income is low at destination while full loan + premium remains payable due to little rainfall
- Treatment group induced to migrate with insurance is decreasing in basis risk
  - Households assigned to Bogra in 2008 30% likelier to migrate with insurance
  - Others are 8.4% more likely to migrate with insurance
  - Those with less asset developed bear greater basis risk
  - Basis risk factors into decision-making

- Learnings from migration are individual-specific
  - Data on social relationships within village collected in baseline survey
  - Upon regressing remigration in 2009 on
    - past migration in 2008
    - no. of friends who migrated
    - no. of family who migrated
  - ... latter variables had no significant impact on likelihood of remigration compared to own past migration.
  - People learn from their own experiences but not from those of others

- 60% of 2011 migrants say they returned to same employer at same destination
- Employers have incomplete information on workers
- Asymmetry is cleared in time suggesting migrants build an asset which yields returns
- Difficult for migrants to resolve this uncertainty through learning from others

- Subsistence
  - Daily caloric intake 800-1300 p.c.
  - According to model, households may not migrate when close to subsistence
  - Compared distribution of expenditure against cost of minimum calorie requirement
  - Verifies that high proportion of households in control are close to subsistence
- If households are risk averse to falling below subsistence
  - Those at margin should not be migrating in control group
  - Treatment should have largest effect on households at subsistence

Panel A: Migration Rates and Baseline Subsistence Level  
(by Treatment Status)



Subsistence is defined as percentage of food expenditures on total expenditures

- Proportion of individuals within calorie intake interval defined as subsistence by treatment group
- Those not incentivised saw a greater proportion of non-migrants
- Those incentivised saw a higher proportion of migrants

# Findings

- Small incentive lead to large seasonal migration
- On average, migration was successful
- Households given incentive likelier to remigrate
- Model captured poverty trap where households at margins faced risk of falling below subsistence from migration
- Hesitant to draw policy implications due to limitations of quantitative model
- Unable to explain fully why households choose not to save to migrate

- Migration support programs are helpful to alleviate effects of *monga*
- More cost-effective than on-going food subsidies (current anti-famine tool)
- Microcredit currently focused on entrepreneurial development
- Can be augmented to facilitate spatial and seasonal labour market matching with urban employment opportunities