

## Environmental Migration and Land Inundation: An Agent-Based Modeling Approach

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#### I. INTRODUCTION

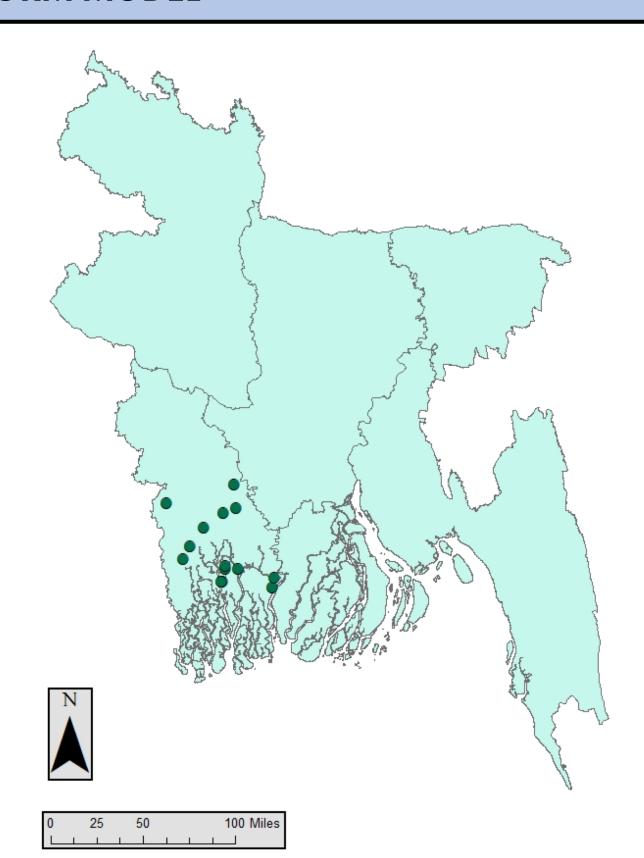
- The decision to migrate is highly complex, and is influenced by economic, social, and environmental drivers.
- As climate change increases pressure on vulnerable communities, migration is one adaptation strategy.
- Bangladesh is one of the most climate vulnerable countries in the world.
- Migration has long been a way of life in Bangladesh, and people adapt to a dynamic natural environment.

#### Research Goal:

Develop an agent-based model of environmental migration as a result of land inundation in Bangladesh.

#### II. DATA AND ANALYSIS TO INFORM MODEL

- Data collected through
   Bangladesh Environment and
   Migration Survey (BEMS).
- Contains migration, employment, and livelihood histories from randomly sampled households at sites.
- 1,695 observations of 1,997 unique variables.
- Previous work used random forest models to identify salient variables associated with migration in this dataset.
- Conducted survival analysis on salient variables for additional insight.



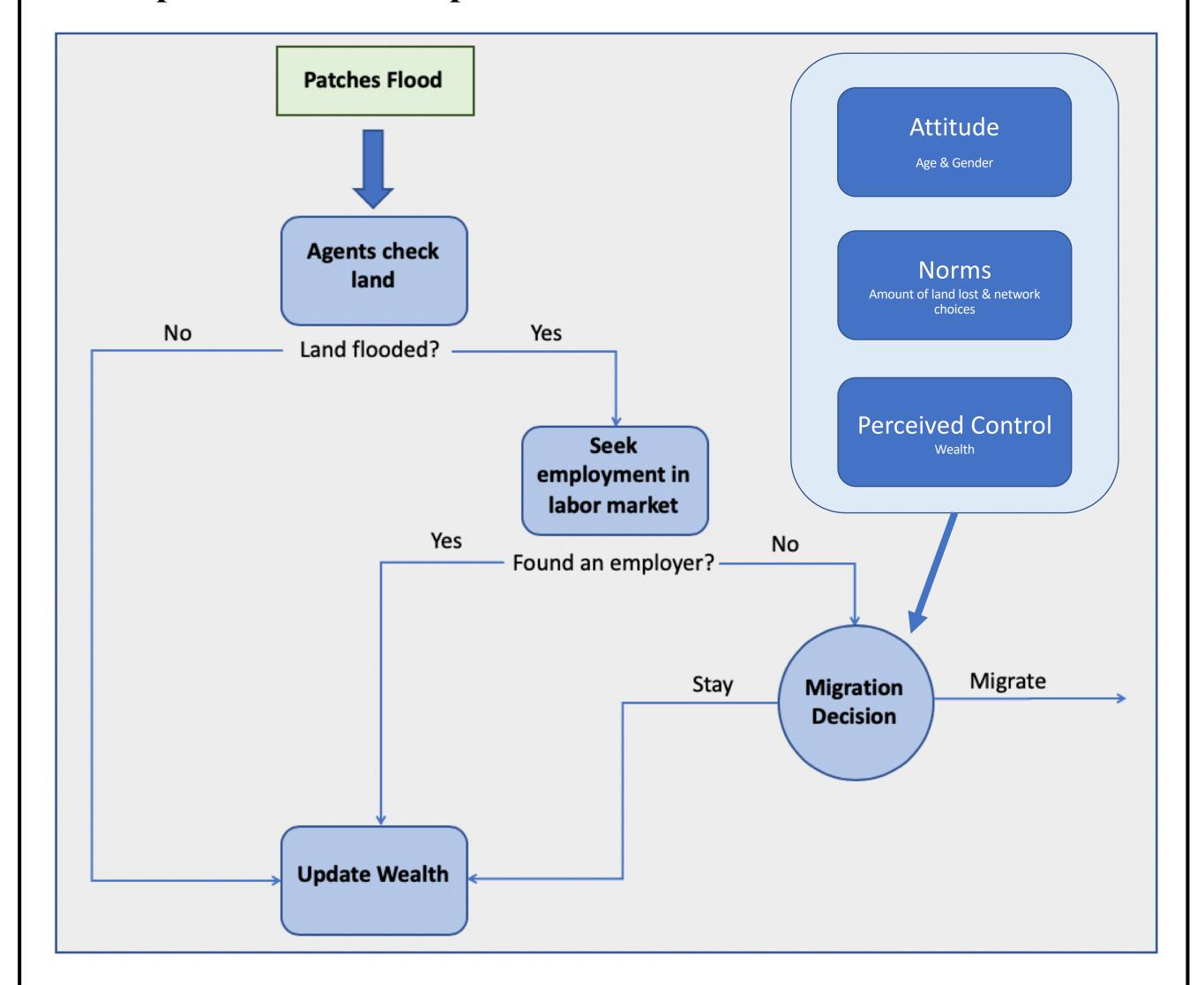
#### Hazard Ratios (Cox Proportional Hazards Model)

	•	1	_		
Business	(N=1704)	1.00 (1.00 - 1.00)	•	I	
Household members	=1704)	0.79 (0.71 - 0.89)			
Refrigerator	Yes (N=169)	reference	•		
	No ( <i>N</i> =1535)	0.63 (0.42 - 0.96) <b>—</b>			
Stove	Yes (N=284)	reference	į.	l	
	No ( <i>N</i> =1420)	0.75 (0.52 - 1.10)	-	-	
Union 1	(N=1704)	1.00 (0.99 - 1.00)			
Nonworkers	=1704)	1.19 <i>(1.05 - 1.35)</i>	-	-	
Spouse meals	No ( <i>N</i> =1681)	reference	•		
	Yes (N=23)	2.40 (1.22 - 4.73)			
# Events: 295; Glob	al p-value (Lo	g-Rank): 3.1684e	-23		
AIC: 4023.41; Conc	ordance Index	x: 0.67	0.5	2	2

Hazards Ratio (HR):
HR = 1, no effect on
baseline hazard
HR < 1, decreases
baseline hazard
HR > 1, increases
baseline hazard

#### III. MODEL OVERVIEW

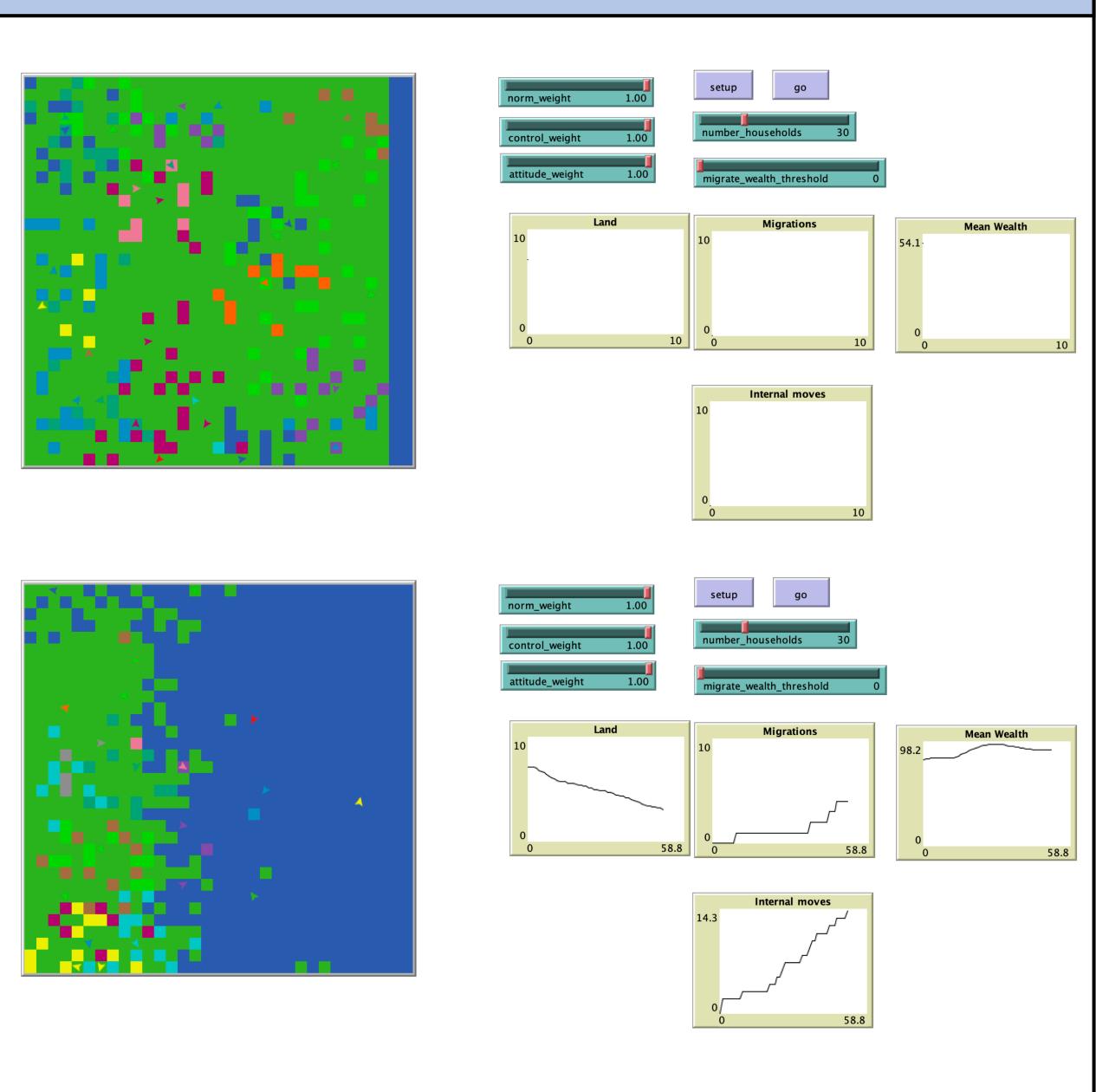
#### Model process at each step



#### Model variables (parameterizing from data)

Agent Variables		Patch Variables
Wealth	Patches owned	Distance to river
Age household head	Willing to pay	Erosion risk
Household Size	Willing to accept	Productivity
Nonworkers	Employees	Inundated?
Land owned	Employer	Land?
Employment	Salary	Owner
Network	Payments	
Moves internal	Someone migrated?	

#### IV. MODEL INTERFACE

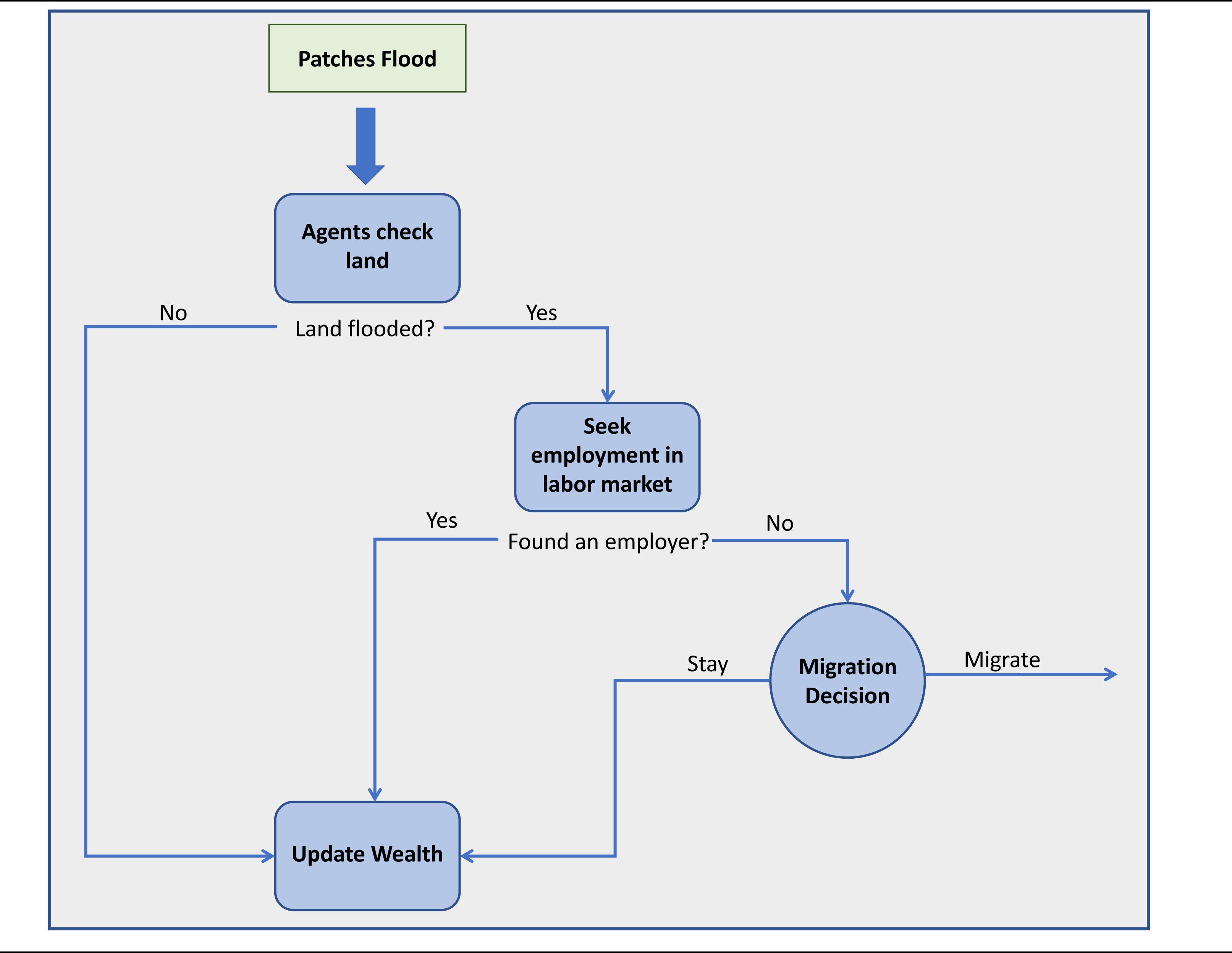


#### V. NEXT STEPS

- Further develop model, incorporate different types of environmental change, decision strategies, and responses.
- Develop migration destinations to include "push" and "pull
- Use model to address questions:
- How will future environmental stress impact migration?
- What household characteristics will be important for future migration?
- How do social networks impact migration?
- Participatory game to study decision making

#### VI. ACKNOWLEDGEMENTS

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## INDIVIDUAL COGNITION

# ATTITUDE TOWARD MIGRATION

Behavioural Beliefs affected by:

AGE GENDER MARITAL STATUS

# SUBJECTIVE NORM / EXPECTATIONS ) OF OTHERS

Normative Beliefs affected by:

VISUAL & PEER
CHANGES CHOICES

PERCEIVED BEHAVIOURAL CONTROL

/ ADAPTIVE CAPACITY

Control Beliefs affected by:

ASSETS EXPERIENCE

## Attitude

Age & Gender

## Norms

Amount of land lost & network choices

# Perceived Control

Wealth