

Urbanization at risk: urban growth, flood risk and climate variability

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Climate migration and urbanization is a rising concern

- ▶ Limited knowledge about the link between global warming and migration (IPCC, 2018)
- ▶ Empirical evidence is mixed (Henderson et al., 2017; Castells-Quintana et al., 2021)

Cities are expanding into flood prone areas (Rentschler et al., 2022; Andreadis et al., 2022)

- ▶ We know less about mechanisms

Migration as an adaptation mechanism

- ▶ Population pressure may induce urban growth into vulnerable areas

Research question

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Research questions

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Empirical approach

Results

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How does climate variability shape urbanization?

- ▶ Do drought shocks affect the expansion of cities?
- ▶ Are cities responding by expanding into floodplains?

Create panel tracking city growth for 6,554 cities in lower and lower-middle income countries between 1992 and 2015

- ▶ Urban area expansion - WSF-Evolution (30m resolution)
- ▶ Global floodplains (Nardi et al., 2019) (250m resolution)
- ▶ Standardised Precipitation-Evapotranspiration Index (SPEI) calculated using ERA5 EWCMF reanalysis data
- ▶ Estimated commuting zones around cities - Functional Urban Area data (Schiavina et al., 2019)

Data - Example

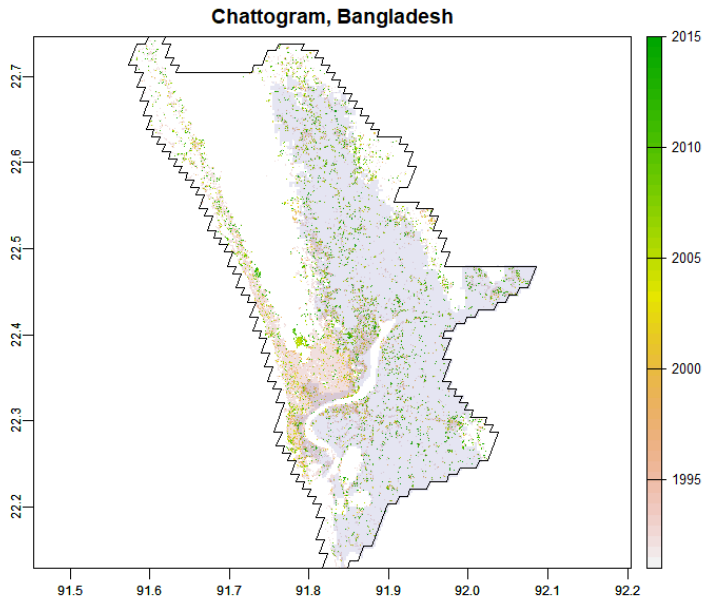


Figure: Growth of urban area, and floodplain delineation.

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Empirical approach

- ▶ I estimate the following distributed lag model:

$$\ln(Y_{c,t}) - \ln(Y_{c,t-1}) = \sum_{k=0}^L \beta_{1k} Drought_{c,t-k} + \gamma_t + \delta_c + \psi_{1c}t + \psi_{2c}t^2 + \varepsilon_{d,t} \quad (1)$$

- ▶ $Y_{c,t}$ is urban or flood area (pixels) in city c , and year t
- ▶ $Drought_{c,t}$, for 90th percentile $SPEI_{100km}$ event
- ▶ δ_c and γ_t : city and year fixed effects
- ▶ ψ : city-specific linear, and quadratic time trends
- ▶ Standard errors account for serial correlation up to 10 years and spatial correlation over 300 km (Conley, 1999)

Drought effects on city growth - full sample

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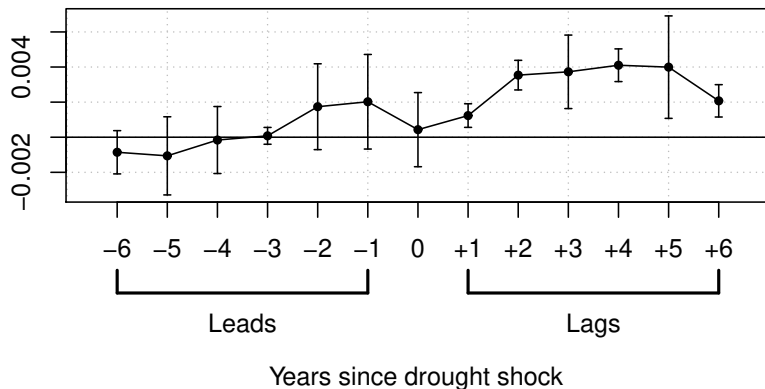
Empirical approach

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Estimate and 95% Conf. Int.



Drought effects on city growth - cities with floodplains

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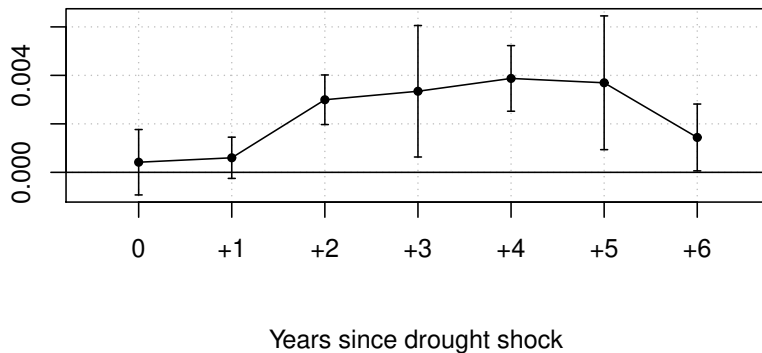
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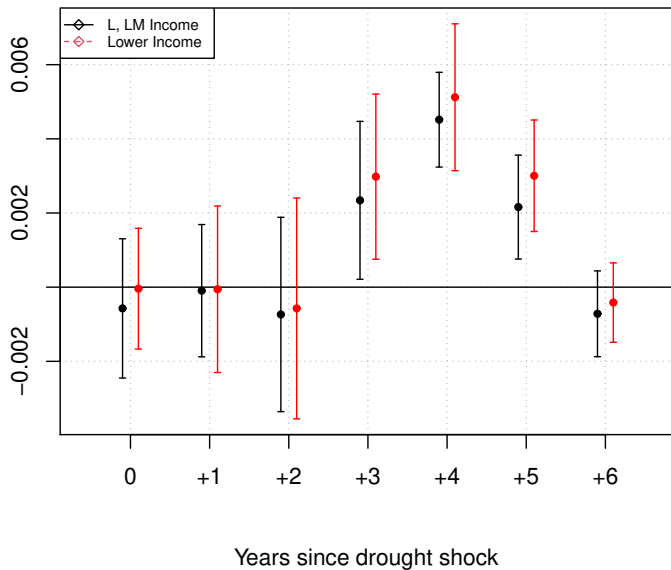
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Drought effects on city floodplain growth



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- ▶ Drought shocks increases urban area in a global sample of cities
 - ▶ Contrast with previous evidence
- ▶ Drought shocks also lead to increase in urban area in floodplains
- ▶ Potential mechanisms
 - ▶ drought shocks reduce agricultural productivity
 - ▶ large influx of migrants increase pressure to build
- ▶ Accumulated effect of between 1 and 1.5%
 - ▶ Defined as $\hat{\Omega}_j = \sum_{L=0}^j \beta_L$ (Hsiang & Jina, 2014)
 - ▶ suggests growth effects rather than level effects (Burke et al., 2015), no temporal displacement (Hsiang, 2016)

References I

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