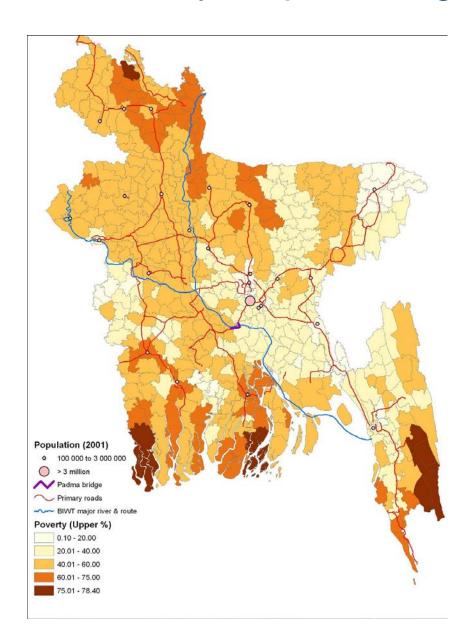
PSIA for transport investment using market accessibility and poverty

Nobuo Yoshida (World Bank)

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Geography and Poverty Map of Bangladesh





East-West Division in Bangladesh

- Large river separate the country's economy between the east (poorer areas) and the west (richer areas)
- Building a bridge to connect the east with the west likely have a big economic impact on both sides
- It is often very costly to build a big bridge
- PSIA will be very useful before investing a huge resource



Our approach

Three step approach to measure the poverty and distributional impact of large infrastructure investment

- 1. Measure the impact of infrastructure investment on market accessibility
- 2. Estimate the relationship between the market accessibility and poverty
- 3. Project poverty reduction via infrastructure using the above



Market accessibility (potential) index

- Market accessibility (potential) index is a measure to see how far a village/town is from big cities
- This measure uses the population size of a city as a proxy of market size
- This measure discounts the market size proxy by travel time



A little more details

The simplest formula of the market accessibility (potential) index is:

$$I_i = \sum_{j} \frac{S_j}{T_{ij}^{\alpha}}$$

 S_j is a size indicator at target j (e.g., population of large cities/towns);

 T_{ij}^{α} is the distance (or travel time) between origin and target As α becomes larger, the influence of market sizes in distant areas declines

Need to select target cities, populations and travel time estimates

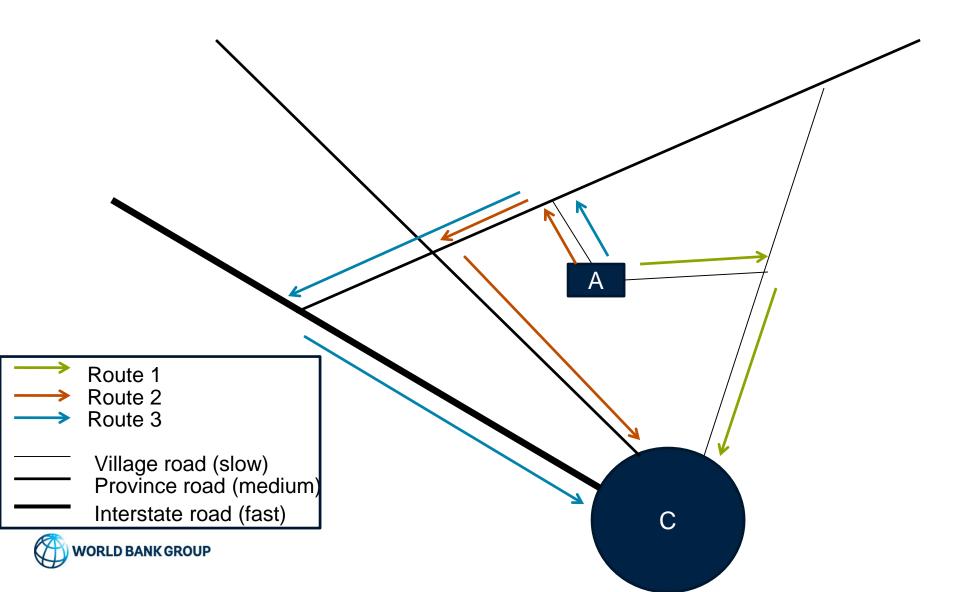


Estimating travel time

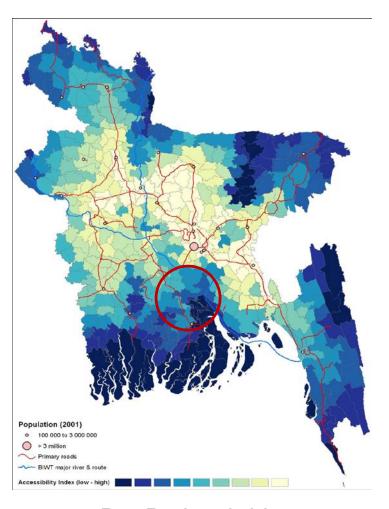
- GIS data and technology play an important role here
- GIS software does the following:
 - Locates all target cities
 - Assess all possible routes between each target city and the origin
 - Search for a route with the shortest travel time for each target city, taking into account road conditions
- This task becomes extremely complex quickly as we increase the number of origins and target cities

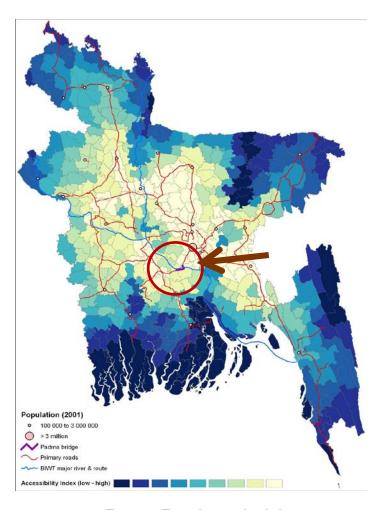


An example: Three roots to go from A to C – Which is quickest?



Padma Bridge Effect on Market Accessibility



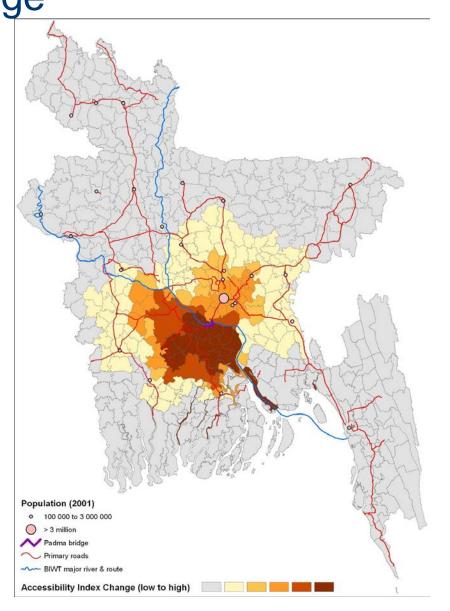






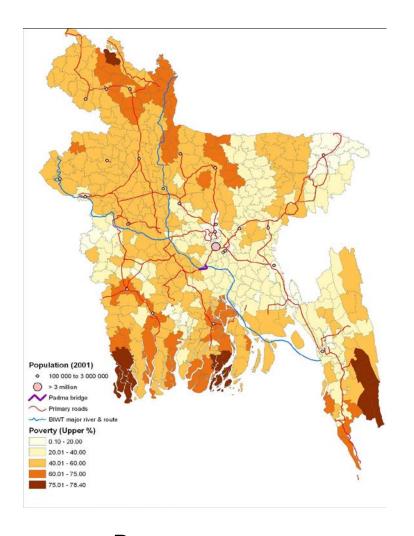


Changes in Market Accessibility Index due to Padma Bridge





Poverty and Market Accessibility



Population (2001) o 100 000 to 3 000 000 > 3 million Primary roads ---- BIWT major river & route Accessibility Index (low - high)

Poverty map

Market accessibility map



Develop an estimation model

 We estimate the relationship between poverty and market accessibility using a spatial regression

$$H_t^i = f(M_{t-1}^i, X_{t-1}^i, Z^i) + \varepsilon_t^i$$

 M_{t-1}^{i} Market accessibility index (lagged)

 X_{t-1}^{i} Other statistics at region i (lagged)

 Z^i Regional fixed effects

 ε_t^i Residuals



Estimate the impact of Padma Bridge on poverty reduction

 Simulate the effects of changes in market accessibility due to infrastructure investment on poverty

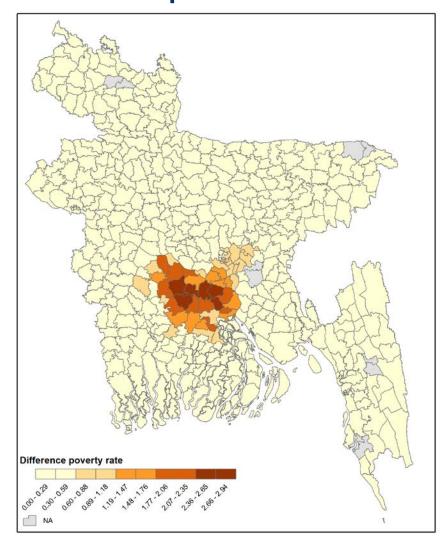
$$\Delta H_t^i = \hat{f}\left(M_{t-1}^{i*}, X_{t-1}^i, Z^i\right) - \hat{f}\left(M_{t-1}^{i0}, X_{t-1}^i, Z^i\right)$$

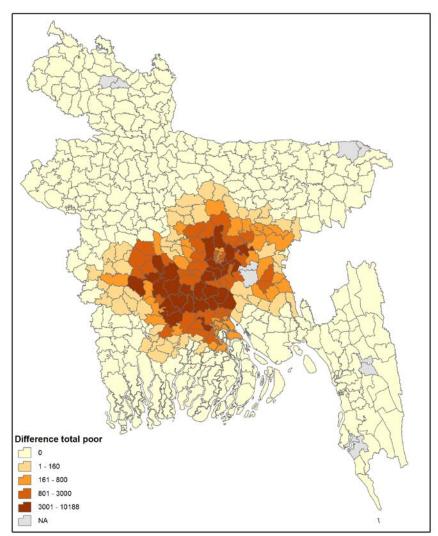
 M_{t-1}^{i0} : Market accessibility (pre investment)

 M_{t-1}^{i*} : Market accessibility (post investment)



Results on Poverty Headcount Rate (%) and Poor Population







Data Needs

- Poverty maps (preferably multiple rounds)
- Road network (preferably, lagged and multiple rounds)
- Other spatial data (Remote sensing; Census aggregates)
- Boundary maps



Thank you!

If you have any question, please let me know at nyoshida@worldbank.org

