# Estimate Under-5 Mortality Rate by Household Economic Status

Fengqing Chao<sup>1</sup>, Danzhen You<sup>2</sup>, Jon Pedersen<sup>3</sup>, Lucia Hug<sup>2</sup>, Leontine Alkema<sup>4</sup>

<sup>1</sup>Institute of Policy Studies, LKYSPP, NUS

<sup>2</sup>Division of Data, Research and Policy, UNICEF

<sup>3</sup>Fafo

<sup>4</sup>Department of Biostatistics and Epidemiology, UMass

Funding sources were research grant from the National University of Singapore, and support from the UN Children's Fund, the United States Agency for International Development, and the Bill & Melinda Gates Foundation.

NUS SSHSPH Professional Update May 17th, 2018

## Background

 The progress in reducing under-5 mortality rate (U5MR; probability of dying before age 5) during the past decades has been remarkable but uneven;

## Background

- The progress in reducing under-5 mortality rate (U5MR; probability of dying before age 5) during the past decades has been remarkable but uneven;
- We need to better understand who and where the most disadvantaged and vulnerable children are, and how U5MR disparity changes overtime;

## Background

- The progress in reducing under-5 mortality rate (U5MR; probability of dying before age 5) during the past decades has been remarkable but uneven;
- We need to better understand who and where the most disadvantaged and vulnerable children are, and how U5MR disparity changes overtime;
- This project dis-aggregated U5MR by household economic status using wealth quintile.

Introduction Data Method Results Summary

## Background

- The progress in reducing under-5 mortality rate (U5MR; probability of dying before age 5) during the past decades has been remarkable but uneven;
- We need to better understand who and where the most disadvantaged and vulnerable children are, and how U5MR disparity changes overtime;
- This project dis-aggregated U5MR by household economic status using wealth quintile.

Wealth quintile: refer to 5 equal-size birth groups with different levels of household economic status according to the wealth index assigned to each household.

• Used as a proxy for household welfare;

- Used as a proxy for household welfare;
- Computed based on a set of questions asked in household questionnaires;

- Used as a proxy for household welfare;
- Computed based on a set of questions asked in household questionnaires;
- Indicator variables: item that describe household assets and utility services:

- Used as a proxy for household welfare;
- Computed based on a set of questions asked in household questionnaires;
- Indicator variables: item that describe household assets and utility services:
  - Type of flooring (dirt/cement/parquet)? Type of toilet (bush/flush)? Has electricity? Number of members per sleeping room? etc.

- Used as a proxy for household welfare;
- Computed based on a set of questions asked in household questionnaires;
- Indicator variables: item that describe household assets and utility services:
  - Type of flooring (dirt/cement/parquet)? Type of toilet (bush/flush)? Has electricity? Number of members per sleeping room? etc.
- Use principal component analysis (PCA) to assign the indicator weights, and get the weighted sum as the wealth index.

## Wealth quintiles

- 5 equal-size birth groups based on the distribution of the wealth index from household population;
- The 1st quintile group refers to the poorest household;
- The 5th quintile group is the richest.

## Objectives

 Estimate the levels and trends of U5MR by wealth quintile for low- and middle-income countries (LMICs) from 1990 to 2016;

## Objectives

- Estimate the levels and trends of U5MR by wealth quintile for low- and middle-income countries (LMICs) from 1990 to 2016;
- Estimate the expected relation between the relative disparity of quintile-specific U5MR and the national-level U5MR (all quintiles combined);

## Objectives

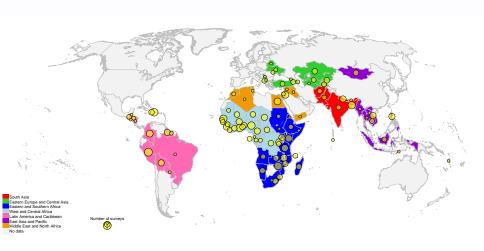
- Estimate the levels and trends of U5MR by wealth quintile for low- and middle-income countries (LMICs) from 1990 to 2016;
- Estimate the expected relation between the relative disparity of quintile-specific U5MR and the national-level U5MR (all quintiles combined);
- Identify countries with the highest U5MR disparity on absolute and relative scales.

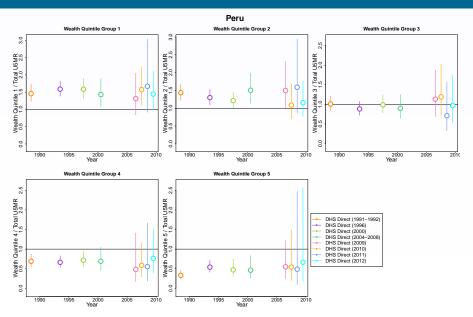
 99 LMICs with Demographic Health Surveys and Multiple Indicator Cluster Surveys data;

- 99 LMICs with Demographic Health Surveys and Multiple Indicator Cluster Surveys data;
- 319 surveys in total (each country has 1–8 surveys);

- 99 LMICs with Demographic Health Surveys and Multiple Indicator Cluster Surveys data;
- 319 surveys in total (each country has 1–8 surveys);
- Each survey has 1 data point for each wealth quintile;

- 99 LMICs with Demographic Health Surveys and Multiple Indicator Cluster Surveys data;
- 319 surveys in total (each country has 1–8 surveys);
- Each survey has 1 data point for each wealth quintile;
- Range of reference year from observations: 1987–2012;





#### Model Overview

$$Q_{w} \xleftarrow{Q_{w}/Q_{total}}_{w=1,\dots,5} R_{w} \xrightarrow{Q_{w}/Q_{3}}_{w=1,2,4,5} S_{w} \xrightarrow{U_{w} \cdot P_{w}}_{w=1,2,4,5} \begin{cases} U_{w} & \text{splines function} \\ P_{w} & \text{time series} \end{cases}$$

#### Data model

$$Q_{w} \xleftarrow{Q_{w}/Q_{total}}_{w=1,\dots,5} \textbf{\textit{R}}_{\textbf{\textit{w}}} \xrightarrow{Q_{w}/Q_{3}}_{w=1,2,4,5} S_{w} \xrightarrow{U_{w} \cdot P_{w}}_{w=1,2,4,5} \begin{cases} U_{w} & \text{splines function} \\ P_{w} & \text{time series} \end{cases}$$

The data model is:

$$\log(r_i) \sim N(\log(R_{w[i]}), \gamma_i^2), \text{ for } w = 1, \dots, 5.$$

 r<sub>i</sub>: input data points, is the i-th observed ratio of the wealth quintile-specific U5MR to the national-level U5MR;

#### Data model

$$Q_w \xleftarrow{Q_w/Q_{total}}_{w=1,\dots,5} \begin{cases} $R_{\bf w}$ & $\frac{Q_w/Q_3}{w=1,2,4,5}$ & $S_w$ & $\frac{U_w \cdot P_w}{w=1,2,4,5}$ & $P_w$ & time series \\ \hline \end{cases}$$

The data model is:

$$\log(r_i) \sim N(\log(R_{w[i]}), \gamma_i^2), \text{ for } w = 1, \dots, 5.$$

- r<sub>i</sub>: input data points, is the i-th observed ratio of the wealth quintile-specific U5MR to the national-level U5MR;
- $R_{w[i]}$ : defined as  $Q_w/Q_{total}$ ;

#### Data model

$$Q_w \xleftarrow{Q_w/Q_{total}}_{w=1,\dots,5} \textbf{\textit{R}}_{\textbf{\textit{w}}} \xrightarrow{Q_w/Q_3}_{w=1,2,4,5} S_w \xrightarrow{U_w \cdot P_w}_{w=1,2,4,5} \begin{cases} U_w & \text{splines function} \\ P_w & \text{time series} \end{cases}$$

The data model is:

$$\log(r_i) \sim N(\log(R_{w[i]}), \gamma_i^2), \text{ for } w = 1, \dots, 5.$$

- r<sub>i</sub>: input data points, is the i-th observed ratio of the wealth quintile-specific U5MR to the national-level U5MR;
- $R_{w[i]}$ : defined as  $Q_w/Q_{total}$ ;
- $\gamma_i^2$ : a given value, is the sampling variance for the *i*-th observation.

## Relation between $R_w$ and $S_w$

$$Q_w \xleftarrow{Q_w/Q_{total}}_{w=1,\dots,5} R_w \xrightarrow{\mathbf{Q_w/Q_3}}_{\mathbf{w=1,2,4,5}} S_w \xrightarrow{U_w \cdot P_w}_{w=1,2,4,5} \begin{cases} U_w & \text{splines function} \\ P_w & \text{time series} \end{cases}$$

For a given country c year t, the quintile-specific U5MRs  $Q_w$  are related to the national-level U5MR  $Q_{total}$  as:

$$Q_{total} = \sum_{w=1}^{5} Q_w/5.$$

## Relation between $R_w$ and $S_w$

$$Q_w \xleftarrow{Q_w/Q_{total}}_{w=1,\dots,5} R_w \xrightarrow[{\textbf{W}=\textbf{1,2,4,5}}]{\textbf{Q_w/Q_3}} S_w \xrightarrow[{w=1,2,4,5}]{U_w \cdot P_w} \begin{cases} U_w & \text{splines function} \\ P_w & \text{time series} \end{cases}$$

For a given country c year t, the quintile-specific U5MRs  $Q_w$  are related to the national-level U5MR  $Q_{total}$  as:

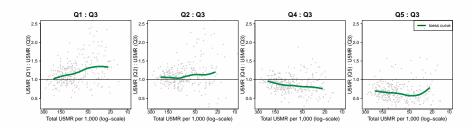
$$Q_{total} = \sum_{w=1}^{5} Q_w/5.$$

To incorporate above constraint, and given that we define  $R_w = Q_w/Q_{total}$  and  $S_w = Q_w/Q_3$ , we have:

$$R_w = f_w(S_1, S_2, S_4, S_5).$$

## Model for $S_w$

$$Q_w \xleftarrow{Q_w/Q_{total}}_{w=1,\dots,5} R_w \xrightarrow[w=1,2,4,5]{Q_w/Q_3} \textbf{S}_w \xrightarrow[w=1,2,4,5]{U_w \cdot P_w} \begin{cases} U_w & \text{splines function} \\ P_w & \text{time series} \end{cases}$$



Method

Results

## Model for $S_w$

$$Q_w \xleftarrow{Q_w/Q_{total}}_{w=1,\dots,5} R_w \xrightarrow{Q_w/Q_3}_{w=1,2,4,5} S_w \xrightarrow{U_w \cdot P_w}_{w=1,2,4,5} \begin{cases} \textbf{\textit{U}}_w & \text{splines function} \\ \textbf{\textit{P}}_w & \text{time series} \end{cases}$$

 $S_w$  is modeled as the product of two components:

$$S_w = U_w \cdot P_w$$
, for  $w = 1, 2, 4, 5$ .

•  $U_w$ : the expected ratio is a function of  $Q_{total}$ ;

Results

Summary

$$Q_w \xleftarrow{Q_w/Q_{total}}_{w=1,\dots,5} R_w \xrightarrow{Q_w/Q_3}_{w=1,2,4,5} S_w \xrightarrow{U_w \cdot P_w}_{w=1,2,4,5} \begin{cases} \textbf{\textit{U}}_w & \text{splines function} \\ \textbf{\textit{P}}_w & \text{time series} \end{cases}$$

 $S_w$  is modeled as the product of two components:

$$S_w = U_w \cdot P_w$$
, for  $w = 1, 2, 4, 5$ .

- $U_w$ : the expected ratio is a function of  $Q_{total}$ ;
  - modeled by a B-splines regression function;

## Model for $S_w$

$$Q_w \xleftarrow{Q_w/Q_{total}}_{w=1,\dots,5} R_w \xrightarrow[w=1,2,4,5]{Q_w/Q_3} S_w \xrightarrow[w=1,2,4,5]{U_w \text{ splines function}} \begin{cases} \textbf{\textit{U}}_{\textbf{\textit{w}}} & \text{splines function} \\ \textbf{\textit{P}}_{\textbf{\textit{w}}} & \text{time series} \end{cases}$$

 $S_w$  is modeled as the product of two components:

$$S_w = U_w \cdot P_w$$
, for  $w = 1, 2, 4, 5$ .

- $U_w$ : the expected ratio is a function of  $Q_{total}$ ;
  - modeled by a B-splines regression function;
  - Q<sub>total</sub>: the UNICEF estimates of national U5MR

## Model for $S_w$

$$Q_w \xleftarrow{Q_w/Q_{total}}_{w=1,\dots,5} R_w \xrightarrow[w=1,2,4,5]{Q_w/Q_3} S_w \xrightarrow[w=1,2,4,5]{U_w \text{ splines function}} \begin{cases} \textbf{\textit{U}}_{\textbf{\textit{w}}} & \text{splines function} \\ \textbf{\textit{P}}_{\textbf{\textit{w}}} & \text{time series} \end{cases}$$

 $S_w$  is modeled as the product of two components:

$$S_w = U_w \cdot P_w$$
, for  $w = 1, 2, 4, 5$ .

- $U_w$ : the expected ratio is a function of  $Q_{total}$ ;
  - modeled by a B-splines regression function;
  - Q<sub>total</sub>: the UNICEF estimates of national U5MR
- $P_w$ : multiplier to capture the deviations of ratio  $S_w$  from the expected ratio  $U_w$ , modeled by a time series model.

## Compute $Q_w$

$$Q_{w} \xleftarrow{Q_{w}/Q_{total}}_{w=1,...,5} R_{w} \xrightarrow{Q_{w}/Q_{3}}_{w=1,2,4,5} S_{w} \xrightarrow{U_{w} \cdot P_{w}}_{w=1,2,4,5} \begin{cases} U_{w} & \text{splines function} \\ P_{w} & \text{time series} \end{cases}$$

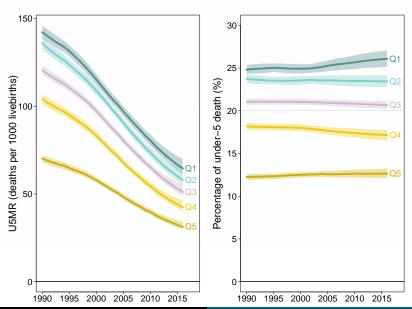
With the modeled  $R_w$ , the quintile-specific U5MR  $Q_w$  is computed as:

$$Q_w = R_w \cdot Q_{total}$$
, for  $w = 1, \dots, 5$ .

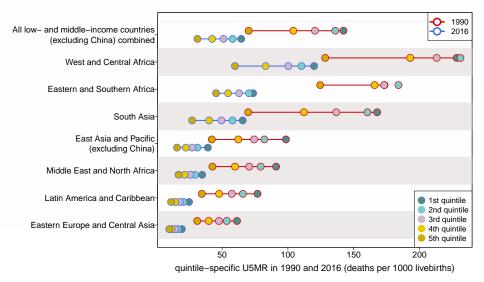
• *Q*<sub>total</sub>: given values; the UNICEF estimates of national U5MR.

Introduction Data Method Results Summary

## Aggregated results for all LMICs (excluding China)

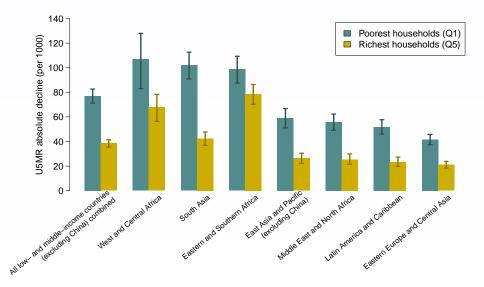


## Regional results: absolute disparity



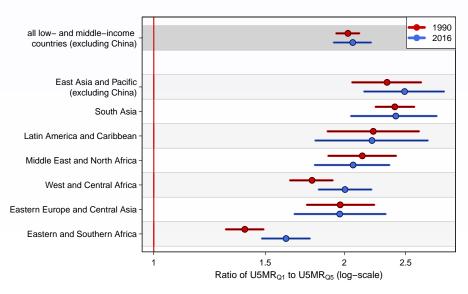
Introduction Data Method **Results** Summary

## Regional results: absolute disparity



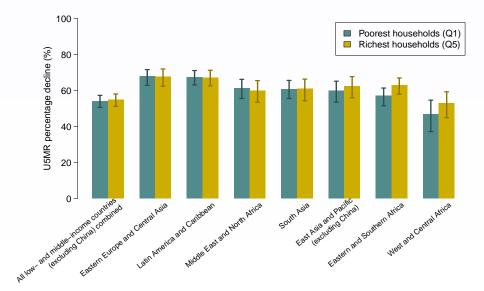
Method Results

## Regional results: relative disparity



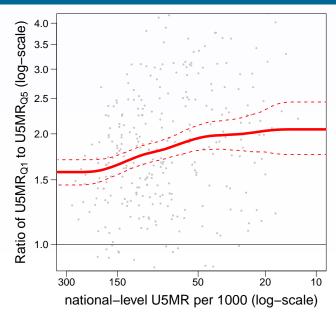
Introduction Data Method **Results** Summary

## Regional results: relative disparity



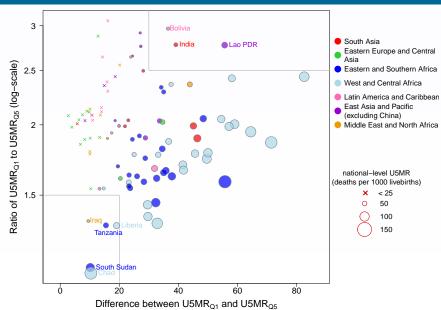
Introduction Data Method **Results** Summary

## Relative disparity vs national U5MR



ntroduction Data Method **Results** Summary

## Country disparity in 2016



## Summary

- We assessed the absolute and relative disparities of U5MR between the poorest and the richest quintiles;
- The poorest households in LMICs (excluding China) have greater reduction in U5MR than their richest counterparts;
- On relative scale, the poorest subpopulations remain at a disadvantage in most LMICs.
- This work is recently published:

Chao F, You D, Pedersen J, Hug L, Alkema L. National and regional under-5 mortality rate by economic status for low-income and middle-income countries: a systematic assessment. *The Lancet Global Health*. 2018 May 31;6(5):e535-47.

# Thank you!

Contact: chao.fengqing@nus.edu.sg