

**THE DEPTH OF  
MULTIDIMENSIONAL  
POVERTY: A MATTER OF  
SPACE**

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CONFERENCE: DRIVERS AND  
CONSEQUENCES**

**SEPTEMBER 29, 2023**

# ROADMAP



**Why the  
depth of  
MPI?**



**Contextualization -  
conceptual  
framework**



**Extension:  
measuring  
"depth"**



**Data**



**Empirical  
findings**



**Discussion**

# TARGETS

## **Propose an extension of the AF multidimensional poverty measure which measures the depth of poverty**

Are measures of multidimensional poverty depth necessary whatsoever? If so, how the current measures could draw advantages from the ordinality properties of indicators used to measure poverty?

## **Comparing groups: estimate subnational decompositions of AF-depth**

Does a measure of depth of poverty provide additional tools to better inform differences across space and over time?

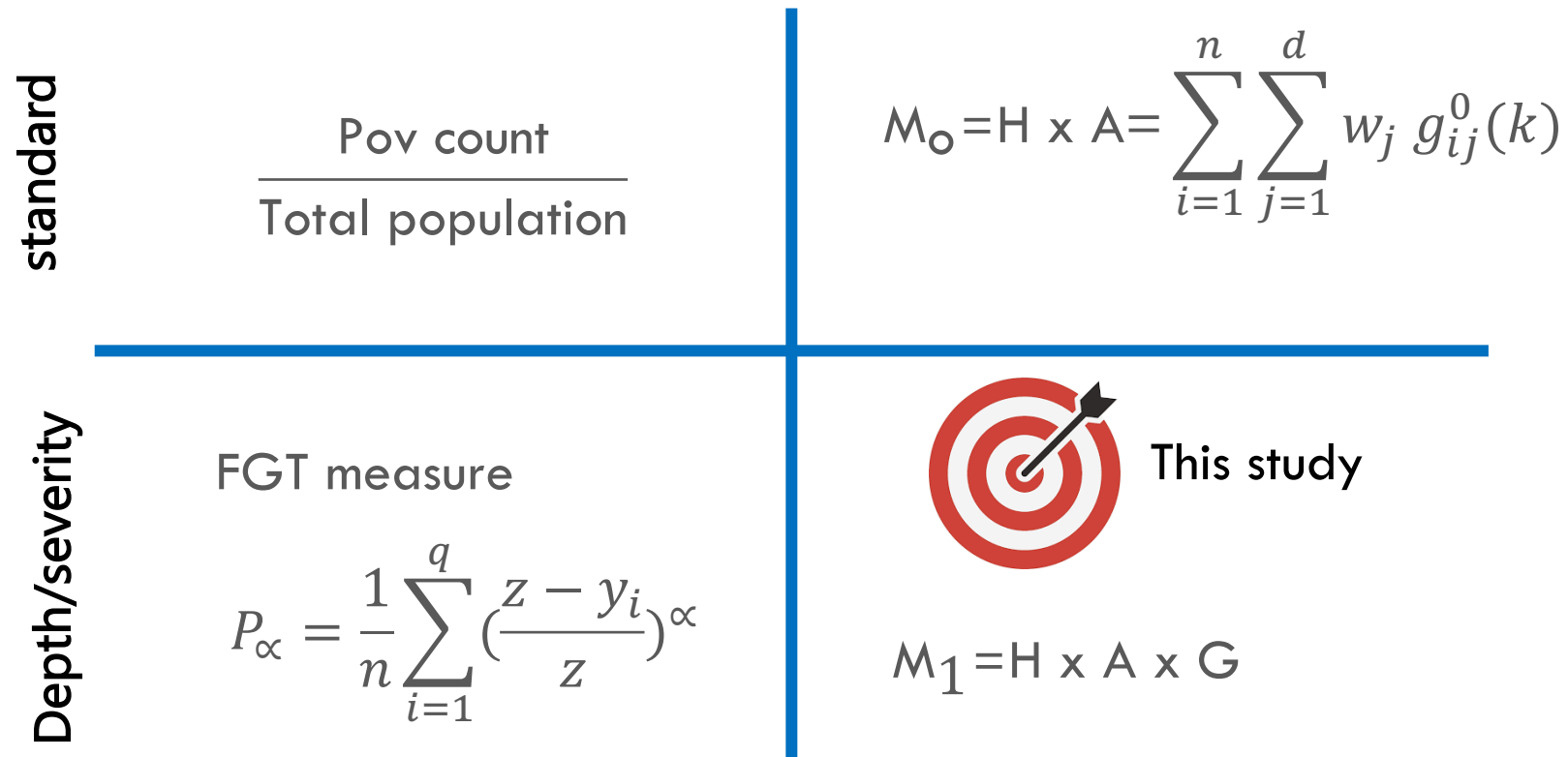
## **Empirical application using the official MPI of Colombia**

# THE MEASUREMENT OF MULTIDIMENSIONAL POVERTY

- “Most of the remaining unresolved issues in poverty analysis are related directly or indirectly to the multi-dimensional nature and dynamics of poverty” (Thorbecke, 2007).
- One of the most popular measure of multidimensional poverty is Alkire and Foster (2011). “Counting and multidimensional poverty measurement.” *Journal of Public Economics*, 95 (7-8).
- Sen’s capability approach is a **theoretical framework of poverty**. **Social arrangements** are prioritized based on the extent of freedom that people have to **fulfill achievements they value**.

*Equality of what? (1979)*

# WHAT AND WHY THE “DEPTH” OF MULTIDIMENSIONAL POVERTY?



# WHAT AND WHY THE “DEPTH” OF MULTIDIMENSIONAL POVERTY?

“How is poverty or deprivation to be measured in the presence of ordinal, categorical, or qualitative data? Must we retreat to a head count ratio, or can we continue to evaluate the depth or distribution of deprivations[...]? This issue can also arise in unidimensional studies but is almost inevitable in discussions of multidimensional poverty where data on capabilities and functionings can have the most rudimentary of measurement characteristics.”

Foster, Greer and Thorbecke (2010). The Foster-Greer-Thorbecke (FGT) Poverty Measures: Twenty-Five Years Later. *The Journal of Inequality*, 8.

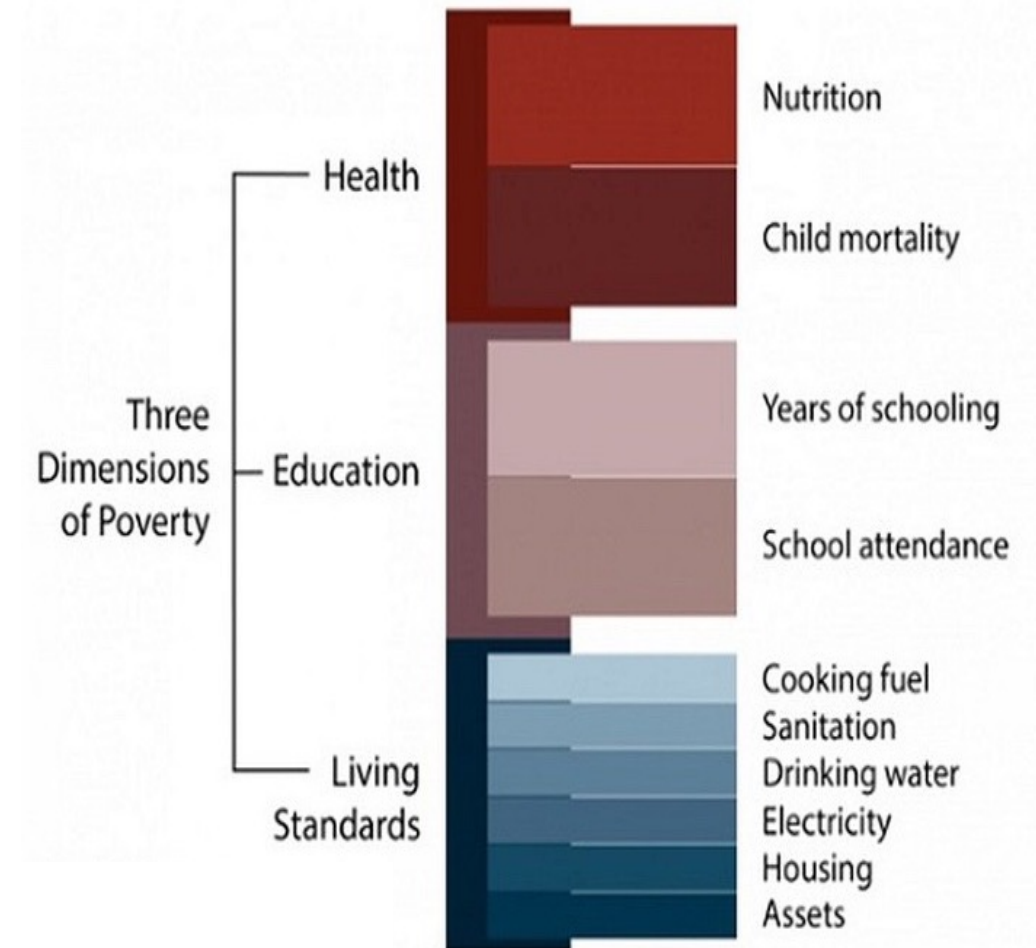
# PREVIOUS STUDIES

- Bennett and Hatzimasoura (2011) propose an additive poverty index in the context of ordinal variables.
- Yalonetzky (2012) proposes an ordinal poverty measure which meets the desirable properties but with empirical limitations.
- Seth and Yalonetsky (2018) is the closest approach to this study. They propose a weighted sum of variables of ordered permutations.

# CONCEPTUAL FRAMEWORK

- **The Alkire and Foster method on multidimensional poverty ( $M_0$ : adjusted headcount ratio)**

$$M_0 = \frac{1}{n} \sum_{i=1}^n \sum_{j=1}^d w_j g_{ij}^0(k) = \frac{q}{n} \times \frac{\sum_{i=1}^q \sum_{j=1}^d w_j q_{ij}^0(k)}{q} = H * A$$



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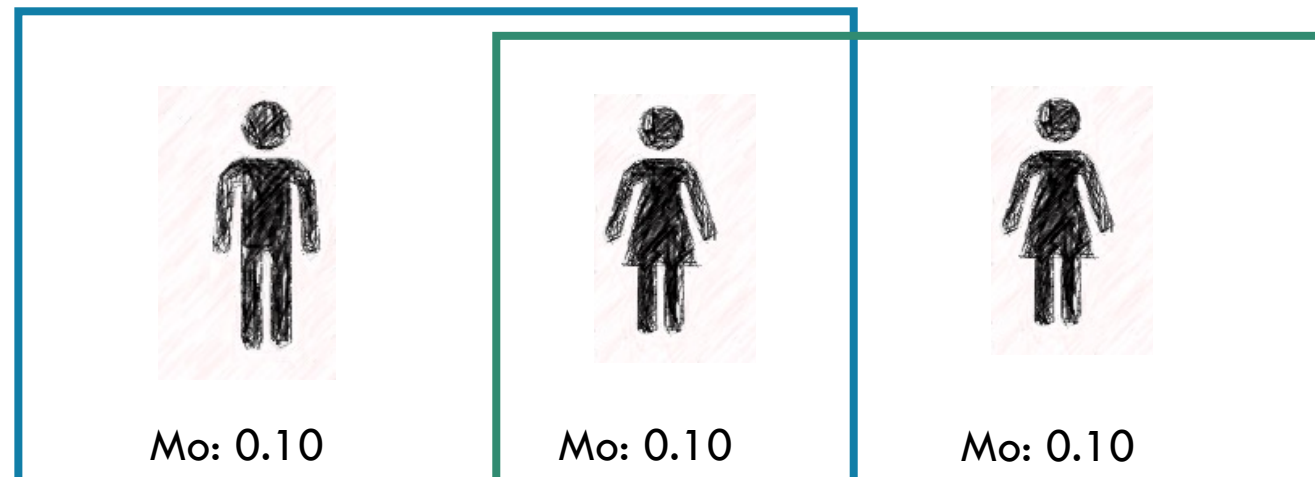
# CONCEPTUAL FRAMEWORK

$$g^0 = \begin{vmatrix} 0 & 0 & 1 \\ 1 & 1 & 1 \\ 1 & 0 & 1 \\ 0 & 0 & 1 \end{vmatrix} \quad c = \begin{vmatrix} 0.\bar{3} \\ 1 \\ 0.\bar{6} \\ 0.\bar{3} \end{vmatrix} \quad c(k:0.34) = \begin{vmatrix} 0.\bar{3} \\ 0 \\ 0.\bar{6} \\ 0.\bar{3} \end{vmatrix}$$

$$w = |0.\bar{3} \quad 0.\bar{3} \quad 0.\bar{3}|$$

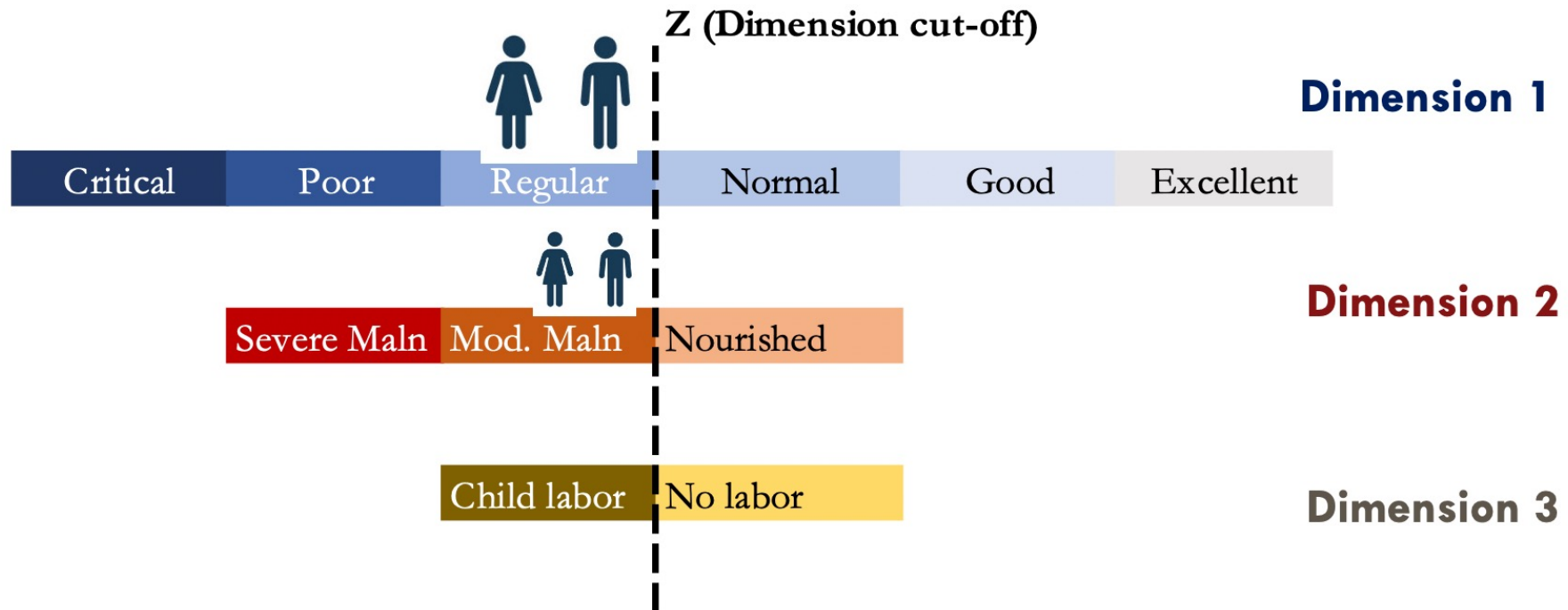
# THE ISSUE OF PRIORITIZATION: COMPARING BETWEEN GROUPS OR INDIVIDUALS

Precedence to the poorer among the poor: “although all [multidimensional] poverty measures are sensitive to depth of deprivations, not all of them endure that the poorest among the poor receive precedence” (Seth and Yalonetzky (SY), 2018).

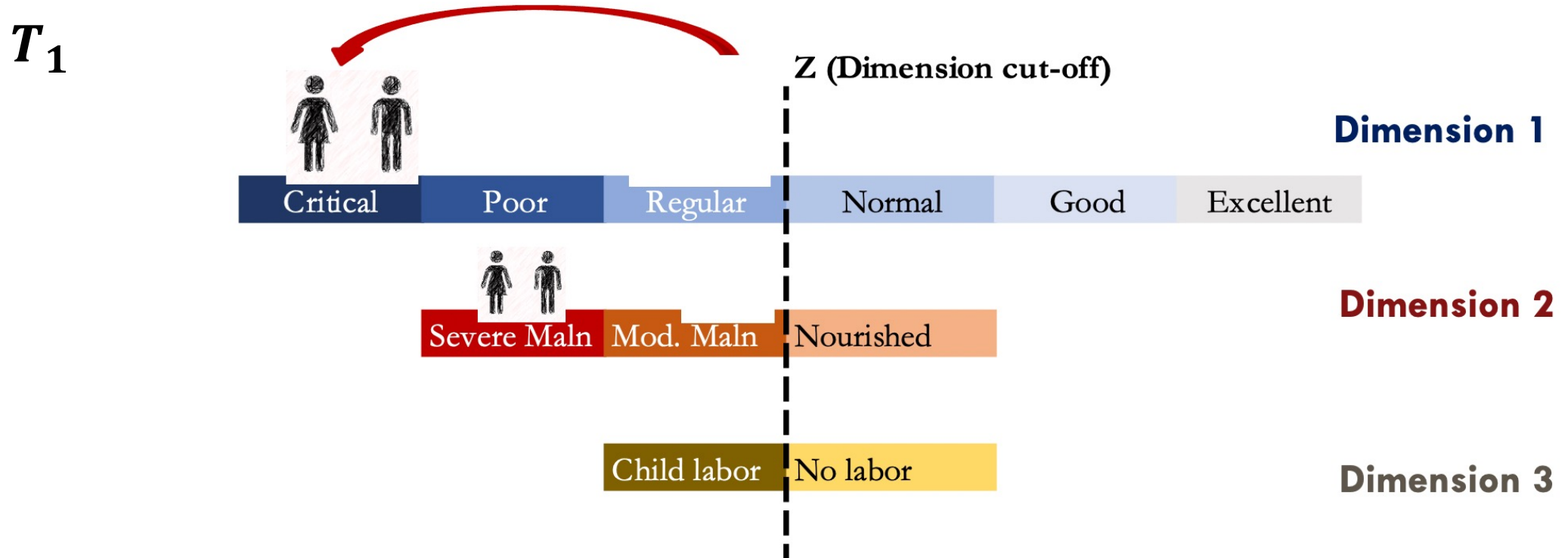


# THE ISSUE OF PRIORITIZATION: CHANGES ACROSS TIME

$T_0$



# THE ISSUE OF PRIORITIZATION: CHANGES ACROSS TIME



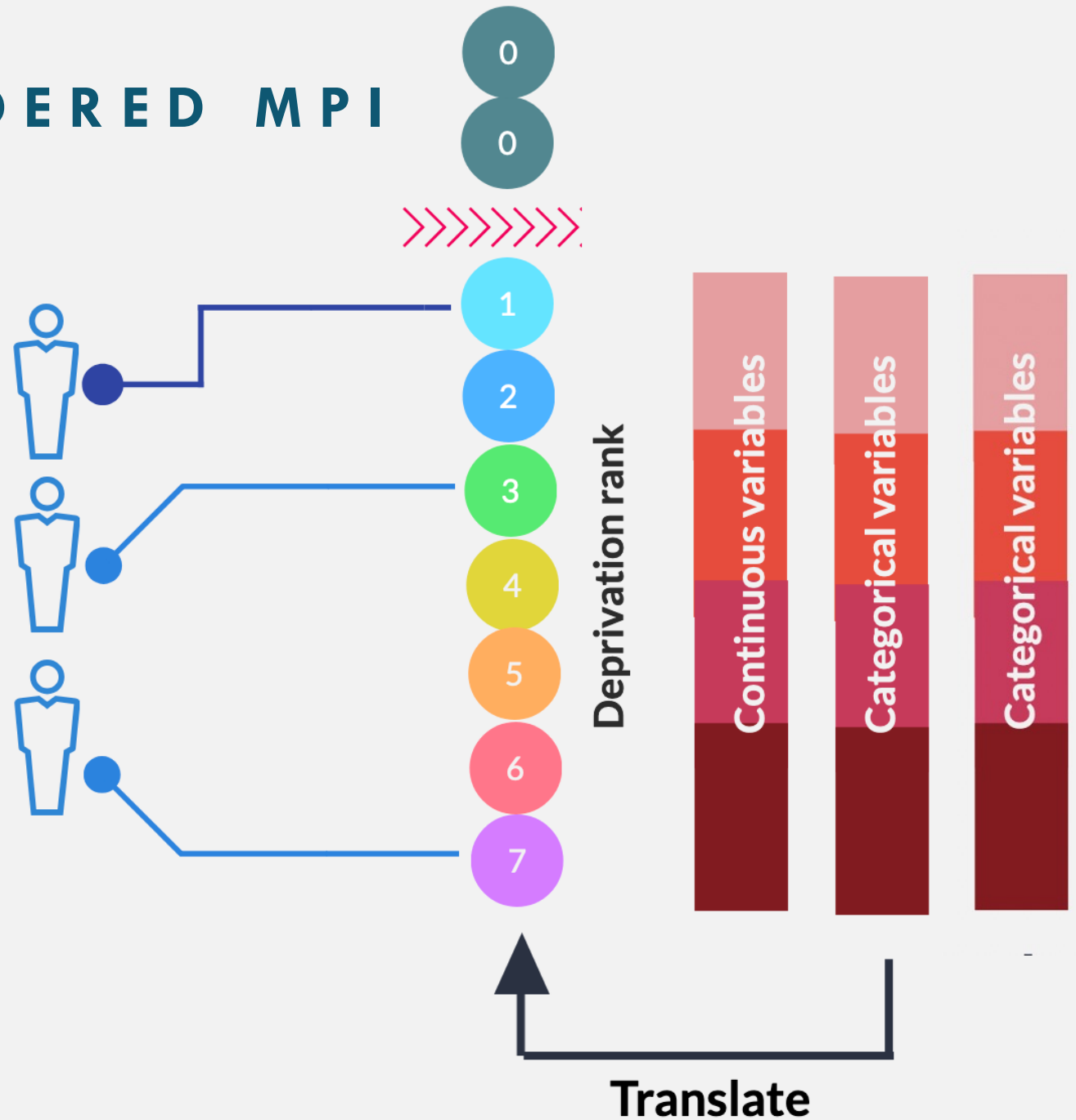
Within the axiomatic framework:

- (1) Minimal precedence to poorer (SY, 2018).
- (2) Greatest precedence to poorer people (SY, 2018).

# EXTENSION: AN ORDERED MPI

Variation 1:  
The  
deprivation  
matrix

$$M_0 \approx \frac{1}{n} \sum_{i=1}^n \sum_{j,r=1}^R w_{jr} g_{(i)jr}^0(k)$$



# EXTENSION: AN ORDERED MPI

## Variation 1:

$$g_{(i)jr}^0(k) = \begin{cases} 1 & \text{if the individual } i \text{ is mapped in the } r\text{th rank below a cut-off } r_j \text{ of } x_j \\ 0 & \text{if the individual } i \text{ is not mapped in the } r\text{th deprived rank of indicator } x_j \end{cases}$$

For multiple variables,  $G$  represents an assembly of partitioned matrices  $G=(G_1, \dots, G_j)$  for each indicator.

# EXTENSION: AN ORDERED MPI

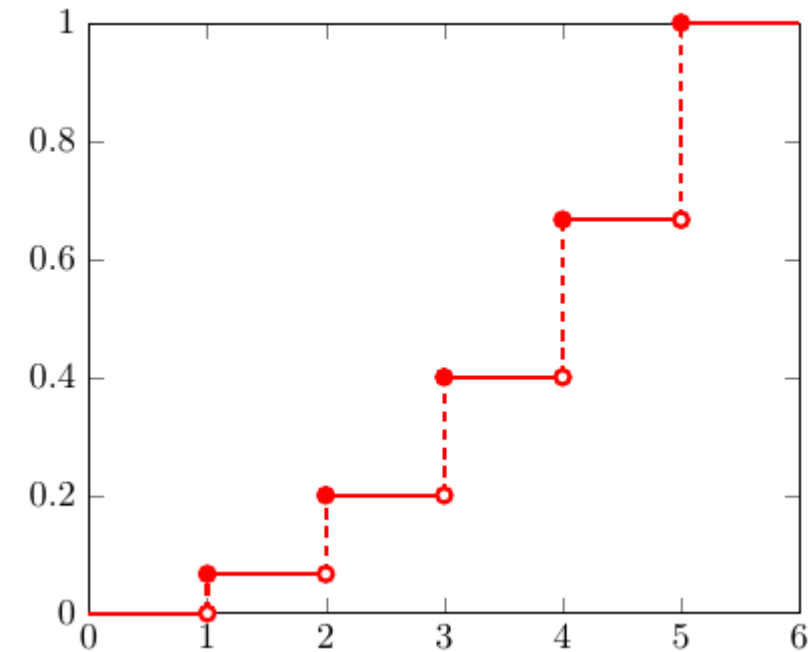
## Variation 2:

$$M_0 = \frac{1}{n} \sum_{i=1}^n \sum_{j=1}^d w_j g_{ij}^0(k) \approx \frac{1}{n} \sum_{i=1}^n \sum_{jr=1}^R w_{jr} g_{(i)jr}^0(k)$$

The proposed weights are defined by

$$w_{jr} = w_j * w_r = w_j * F(r_{jr}) = w_j * \sum_{r_{jo} \leq r_j} f(r_{jr})$$

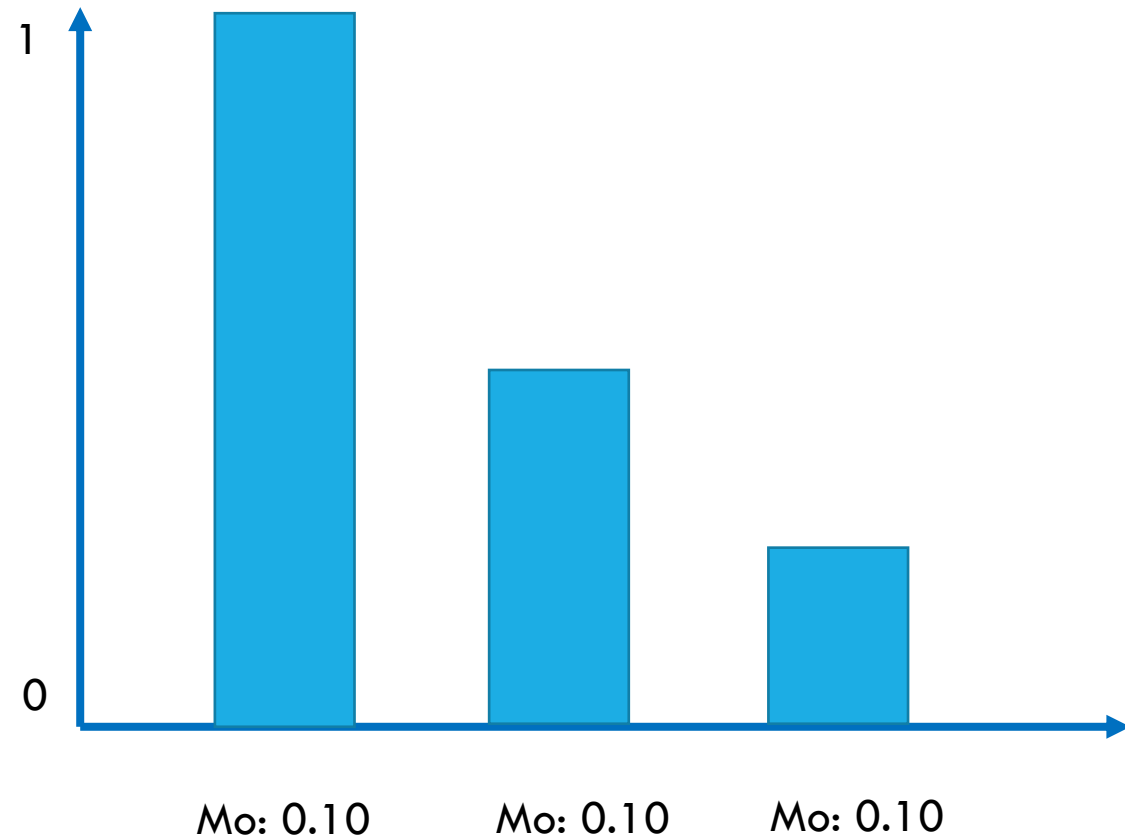
Where  $F(z_{jo})$  is a Cumulative Distribution Function for a discrete variable  $r_{jr}$  that defines the classification of an ordered response of a given dimension  $j$  below a dimension-poverty threshold.



# EXTENSION: A MEASURE OF DEPTH

## Variation 3:

$$\text{Depth : } D = \frac{M_0^r}{M_0} .$$



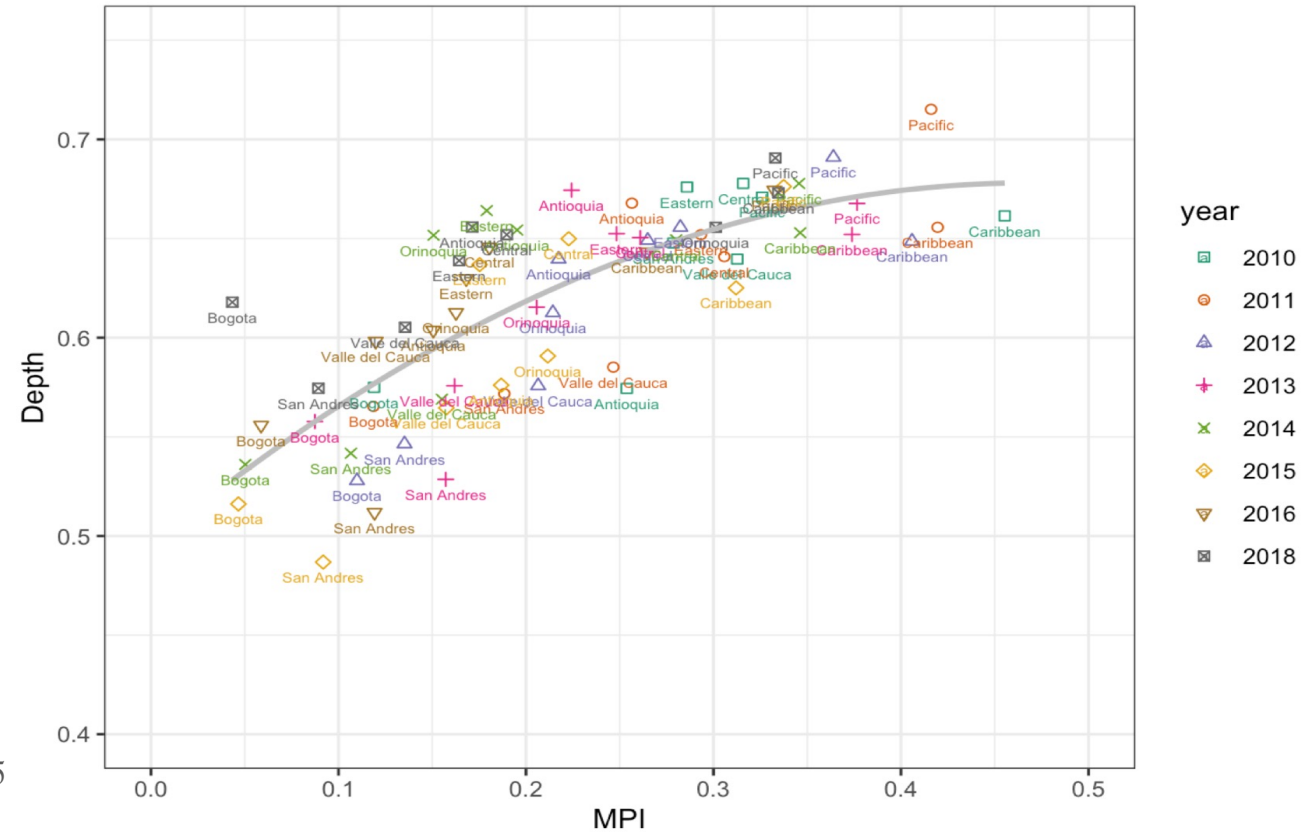
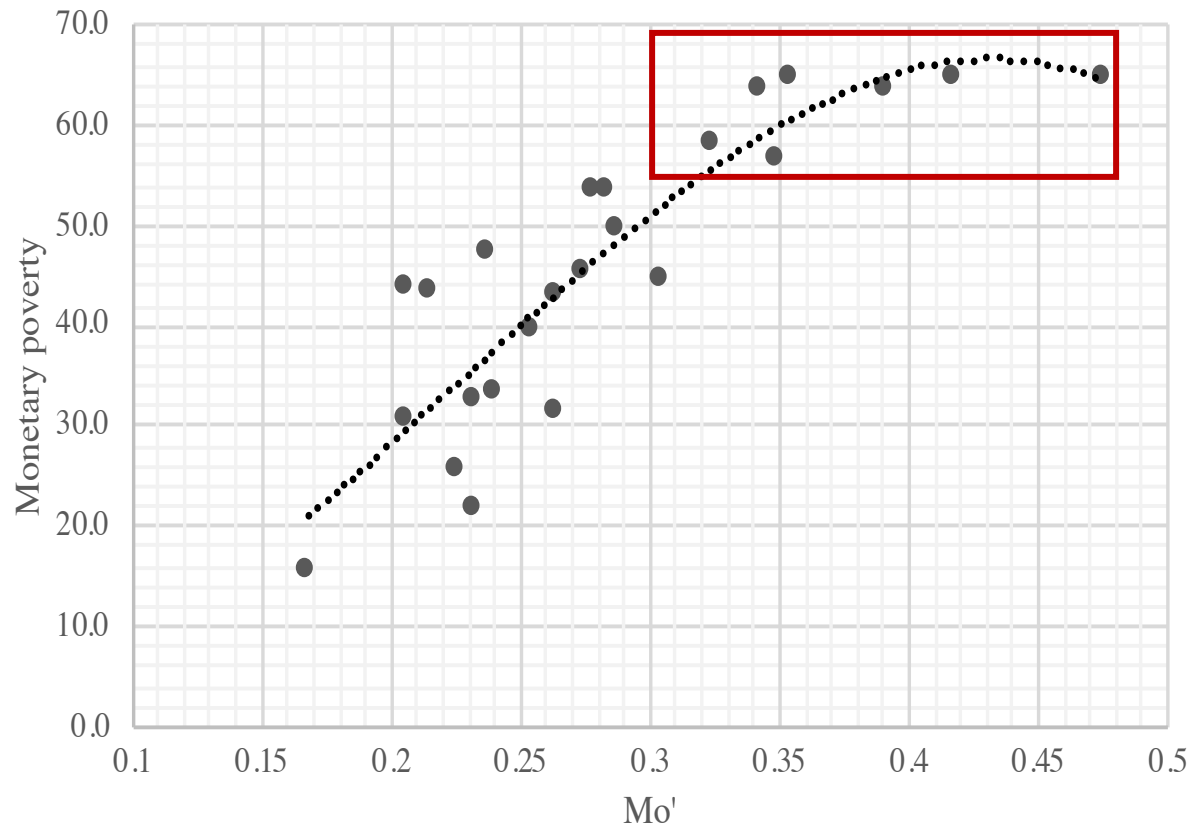


# EMPIRICAL APPLICATION: DATA

- The main source of data are the National Quality of Life Survey Colombia (*Encuesta de la Calidad de Vida*) –ECV-.
- The QLS has a yearly frequency of collection.
- Used to replicate the official MPI of Colombia.
- The dimensions considered in Colombia for the MPI's construction are: education (2 indicators), childhood and youth (4 indicators), health (2 indicators), employment (2 indicators), dwelling conditions (5 indicators).

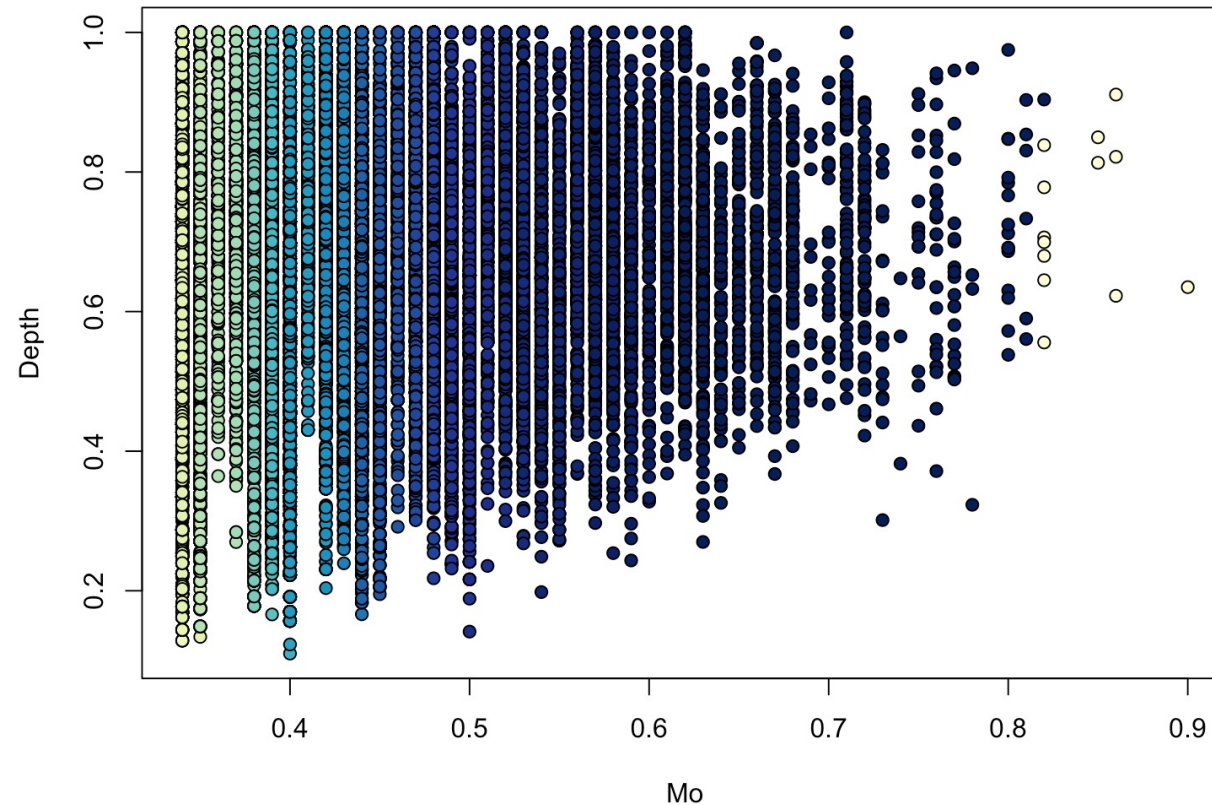
# RESULTS: REGIONAL DIFFERENCES

There is a dissimilarity between regions depth that share the same Mo

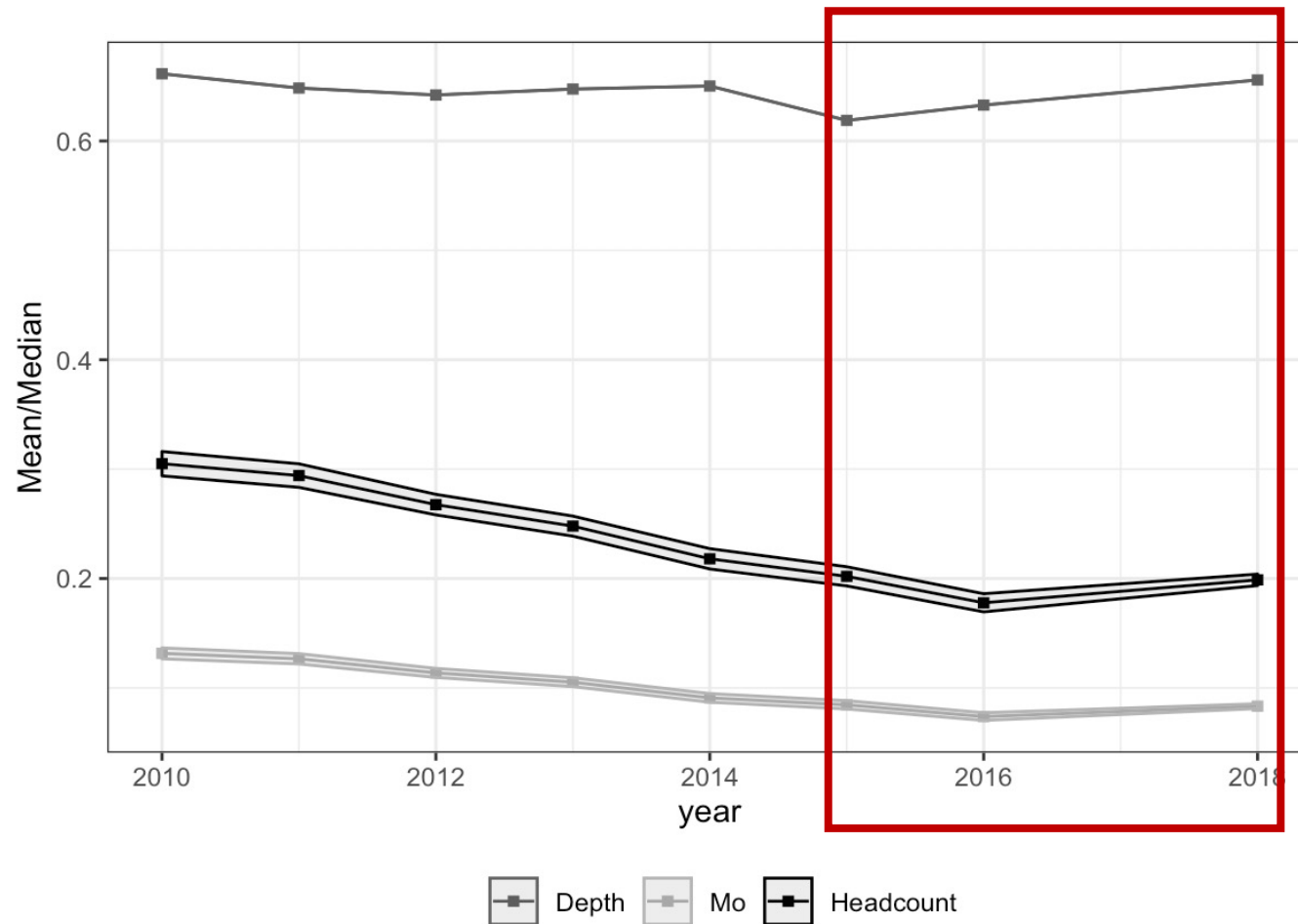


# RESULTS: HOUSEHOLD DIFFERENCES

There are large variabilities of the depth of poverty across different Mo



# RESULTS: CHANGES ACROSS TIME



# RESULTS: DIMENSIONAL DECOMPOSITION BY GROUPS

Contributions of categorical indicators to the MPI, 2019

	<b>Caribbean</b>	<b>Pacific</b>
Water source 1	0.32	0.07
Water source 2	1.19	0.48
Water source 3	1.62	6.32
<b>Water source</b>	<b>3.13</b>	<b>6.87</b>
Education achievement 1	2.87	2.29
Education achievement 2	6.54	7.65
Education achievement 3	6.67	8.39
<b>Education achievement</b>	<b>16.08</b>	<b>18.33</b>

# CONCLUSIONS

- Adjusted multidimensional poverty measures can be further complemented if the richness of ordinal variables are considered to better inform the well-being phenomena.
- A multidimensional poverty that contemplates characteristics of ordinal variables is possible and can highlight differences across space and within dimensions.
- In the absence of adequate spatial price index to correct monetary poverty,  $M_0$  displays a better picture accounting for areas' differences that are not evident in income variables.
- The depth of poverty allows us to identify and prioritize the poorest among the poor.
- The proposed index could be valuable for a *social planner* to assess prioritization of social programs intended to geographical areas (regions, departments, cities) or households. E.g. Sisbén.

# CAVEATS AND WORK IN PROGRESS

- The aggregation of variables of different types for comparative purposes is still arbitrary as well as the density function defined for each dimensional subgroup.
- Alternatively, machine learning is used to get optimal classes of the relevant variables (data driven process).

Thank you!!