
Inequality and the multi-dimensional measurement of development: some remarks

François Bourguignon
Paris School of Economics

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Motivation

- Development **essentially** multi-dimensional
- Population **heterogeneity** with respect to development achievements
- Development measurement may be done explicitly on multi-dimensional basis (**dart board for distinct population groups**)
- Desirable to **summarize** the various dimensions and population heterogeneity into a single (or various) **scalar(s)**
- Most obvious route = **2-stage** procedure used in multi-dimensional inequality measurement

Outline

1. Definition of 2-stage aggregation index and the 'decomposability' issue
2. An elementary aggregate decomposition
3. Sequential decomposition based on co-distribution
4. The FLS and the IA-HDI index
5. Conclusion

1. Definition of 2-stage aggregation index and 'decomposability'

- Individual attributes: $y_i, z_i \quad i = 1, 2 \dots n$
- 1st stage: Aggregator ('utility') function at individual level: $u(y_i, z_i)$ with usual properties (increasing and concave)
- 2nd stage: Overall index (overall mean welfare):

$$W = \frac{1}{n} \sum_{i=1}^n \varphi[u(y_i, z_i)] \quad \text{or} \quad W = G \left\{ \frac{1}{n} \sum_{i=1}^n \varphi[u(y_i, z_i)] \right\}$$

with $\varphi () =$ individual '**welfare**', $\varphi'() > 0$, $\varphi''() < 0$ and $G'() > 0$

- **Decomposability**: possible to express W as:

$$W = F(\bar{y}, \bar{z}; I_y; I_z; I_{yz}) \quad ?$$

2. An elementary aggregate decomposition

- $\varphi(u) = u; G'(\cdot) = 0$
- Dalton multi-dimensional inequality measure

$$D_u = 1 - \frac{\sum_{i=1}^n u(y_i, z_i)}{nu(\bar{y}, \bar{z})}$$

$$nu(\bar{y}, \bar{z}) = \text{Max} \sum_{i=1}^n u(y_i, z_i) \text{ s.t. } \sum_i y_i = n\bar{y}, \sum_i z_i = n\bar{z}$$

- Overall welfare: $W = u(\bar{y}, \bar{z}) \cdot (1 - D_u)$
- Equivalent specification with 'ede' (Multidimensional Atkinson and Tsui indices, Weymark, 2003)
- D_u incorporates implicitly I_y, I_z, I_{yz} . Issue is to make that relationship more explicit

The case of a linear utility function

- Consider the case $\varphi(u) = u$, $u_i = ay_i + bz_i$

Then of course: $W = (a\bar{y} + b\bar{z})$

- But with $\varphi(u) \neq u$ then: $W = \varphi(a\bar{y} + b\bar{z})(1 - D^\varphi)$

- D^φ is a measure of the inequality of u , and can be decomposed as in Shorrocks (1982)

$$W = \varphi(a\bar{y} + b\bar{z})(1 - D^\varphi s_y - D^\varphi s_z)$$

with $s_y = \frac{a^2 \sigma^2(y) + ab \operatorname{cov}(y, z)}{a^2 \sigma^2(y) + 2ab \operatorname{cov}(y, z) + b^2 \sigma^2(z)}$, $s_z = 1 - s_y$

Linear utility function (ct'd)

$$W = \varphi(a\bar{y} + b\bar{z})(1 - D^\varphi s_y - D^\varphi s_z)$$

$$s_y = \frac{a^2 \sigma^2(y) + ab \operatorname{cov}(y, z)}{a^2 \sigma^2(y) + 2ab \operatorname{cov}(y, z) + b^2 \sigma^2(z)}, \quad s_z = 1 - s_y$$

- One can go further and decompose overall inequality into what is due to inequality in y (I_y), inequality in z (I_z) and the covariance between y and z (I_{yz})
- Note that this decomposition is highly non-linear
- Even with zero covariance between y and z , not possible to decompose W into a y - and a z -component.

The case of separability

$$u(y_i, z_i) = a(y_i) + b(z_i); \quad \varphi(u) = u; \quad G(x) \neq x$$

$$W = G\left\{\frac{1}{n} \sum_i [a(y_i) + b(z_i)]\right\} \Rightarrow W = G\left\{a(\bar{y}) \cdot (1 - D_y^a) + b(\bar{z}) \cdot (1 - D_z^b)\right\}$$

- Welfare aggregate index satisfies the general decomposition property
- Co-distribution of y and z does not matter, unlike in the preceding case
- Value of u_{yz} clearly important (as in Atkinson-Bourguignon)

3. Sequential decomposition based on co-distribution

- 'Inequality' of z conditionally on the distribution of y

$$D_u^{z/y} = 1 - \frac{\sum_{i=1}^n u(y_i, z_i)}{\sum_{i=1}^n u[y_i, z_i^*(y_i, \bar{z})]}$$

$$z_i^*(y_i, \bar{z}) = \text{Arg Max}_{z_i} \sum_{i=1}^n u(y_i, z_i) \text{ s.t. } \sum_i z_i = n\bar{z}$$

- Properties of $z_i^*(y_i, \bar{z})$

$$\frac{\partial z_i^*}{\partial y_i} \geq 0 \text{ if } u_{yz} > 0 ; \quad \frac{\partial z_i^*}{\partial y_i} \leq 0 \text{ if } u_{yz} < 0$$

- Particular case: $z_i^*(y_i, \bar{z}) = y_i \frac{\bar{z}}{\bar{y}}$ if $u(y, z)$ HOM $\partial^\circ 1$

Sequential decomposition (ct'd)

- Defining "inequality of y after optimizing x"

$$D_{u^*}^y = 1 - \frac{\sum_{i=1}^n u[y_i, z_i^*(y_i, \bar{z})]}{nu(\bar{y}, \bar{z})}$$

- Hence the sequential decomposition:

$$W = u(\bar{y}, \bar{z}) \cdot (1 - D_{u^*}^y) \cdot (1 - D_u^{z|y})$$

- Remark: $D_u^{z|y}$ incorporates the inequality in z as well as the covariance with y
- This means that one dimension is given some priority

Sequential decomposition (end)

- Particular case: $u(y, z) = (y^\alpha + z^\alpha)^{1/\alpha}$

- Then:

$$D_u^{z|y} = 1 - \frac{1}{n(1 + \bar{z}/\bar{y})} \sum_i \left[1 + \left(\frac{y_i}{z_i} \right)^\alpha \right]^{1/\alpha}$$

- This inequality index actually measures the deviation from the distribution of y !
- As $u(y_i, z_i^*)$ is now linear in y_i , the inequality index for y is now zero.
- The only that matters thus is the degree of non-proportionality of z and y .
- Things would be different with $\varphi(u) \neq u$!

4. The FLS and the IA-HDI index

- Focus here on the conceptual principles behind those indices not their empirical implementation
- In terms of the preceding framework, the FLS may be defined as follows:

$$u(y, z) = (y^\alpha + z^\alpha)^{1/\alpha}; \quad \varphi(u) = u^\alpha; \quad G(x) = x^{1/\alpha}; \quad \alpha \leq 1$$

which is equivalent to :

$$u(y, z) = (y^\alpha + z^\alpha); \quad \varphi(u) = u; \quad G(x) = x^{1/\alpha}$$

leading to:

$$FLS = \left[\frac{1}{n} \sum_i (y_i^\alpha + z_i^\alpha) \right]^{1/\alpha}$$

FLS and IA-HDI: decomposition

$$FLS = \left[\frac{1}{n} \sum_i (y_i^\alpha + z_i^\alpha) \right]^{1/\alpha}$$

- According to earlier result on separability, this leads to the following decomposition

$$FLS = [(\bar{y}^\alpha (1 - D_\alpha^y) + \bar{z}^\alpha (1 - D_\alpha^z))]^{1/\alpha}$$

- Or using Atkinson rather than Dalton measures for the inequality of y and z:

$$FLS = \{ [\bar{y}(1 - A_\alpha^y)]^\alpha + [\bar{z}(1 - A_\alpha^z)]^\alpha \}^{1/\alpha}$$

- A dual decomposition is:

$$FLS = \left\{ \sum_i u_i^\alpha \right\}^{1/\alpha} \text{ with } u_i = \left(\frac{y_i + z_i}{2} \right) \cdot (1 - A(y_i, z_i))$$

FLS and IA-HDI : missing y-z correlation

- Separability implies that the **co-distribution of y and z is ignored** in these indices
- Yet this may be an important aspect of multi-dimensional inequality:
 - If $y = \text{income}$ and $z = \text{health}$, co-distribution of y and z shows **horizontal inequality** w.r.t. health
 - This does not mean that health inequality does not matter per se (but probably not in an usual sense)
 - Issues are linked: health inequality very much affected by infant mortality + infant mortality higher in low income households

FLS and IA-HDI : the CES specification

- First level assumption in FLS = CES- α combination of individual attributes
- Second level assumptions in FLS, CES- α aggregation of individual utilities (equivalent to $\varphi(u) = u^\alpha$ and $G(x)=x^{1/\alpha}$)
- This double CES- α key for separability, decomposition formula and its dual
- First level assumption only –i.e. $\varphi(u) = u$ and $G(x)=x$ leads to rather different results

$$W = \frac{1}{n} \sum_{i=1}^n (y_i^\alpha + z_i^\alpha)^{1/\alpha}$$

- As $u_{yz} > 0$, optimal co-distribution of z = perfect positive correlation

FLS and IA-HDI : the two dimensions of 'inequality'

- Preceding (undesirable) result may be reversed by second-stage assumptions slightly different from FLS
 - For instance, $\varphi(u) = u^\beta$ and $G(x)=x^{1/\beta}$ with $\beta < \alpha$ does not lead to separability and makes a **negative** correlation between y and z being optimal
 - The distinction β vs. α makes very much sense.
 - α describes the way in which attributes combine to define individual utility, β describes the aversion of society to inequality
 - No reason for both to be the same!
 - Same problem as the confusion between risk aversion and intertemporal substitutability in consumer model (see also Shokaert).
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5. Conclusion

- When co-distribution is not observed, FLS/IA-HDI is a clever and consistent way of dealing with multi-dimensionality
- Yet, partial information that may be available on co-distribution –e.g. infant mortality by income level- should be used
- Incomplete information makes the general decomposability issue especially relevant
- With complete information, always possible to correct for 'overall multi-dimensional inequality'
- Shares of attributes in total inequality very indicative: possible to go beyond the linearity case?