

# Designing the Inequality-Adjusted Human Development Index (IHDI)

Sabina Alkire, OPHI

James E. Foster, OPHI and George Washington University

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# Human Development Index

## Motivation

Go beyond per capita income as a wellbeing measure

Ends as well as means

## Broaden space

First form of heterogeneity (F. Bourguignon)

## Practical indicator

Substantial coverage with existing data

Easy to understand

# Human Development Index

## Issues

(i) Choice of dimensions (variables)

income (GDP per capita to become GNI per capita)

education (literacy/enrolment to become years education/school life expectancy)

health (life expectancy)

Why only these?

(ii) Measurability of variables (cardinal or ordinal)

assumes cardinal (at least interval scale)

How can you justify?

(iii) Comparability of variables (full, partial or not at all)

full after normalizing to a common range [0,1]

How does empirical become normatively relevant?

(iv) Aggregation and weighting (general functions?)

mean of means

What about second form of heterogeneity? Inequality

# This Paper

## Theory

Address issue (iv) **inequality** using FLS (2005)

Assume issues (i-iii) solved

Provide plausible calibration method

## Construct IHDI

Based on Atkinson's ede instead of arithmetic mean

Focus on  $H_1$  using geometric mean

And  $H_1^*$  **suppressing dimensional inequality**

## Interpretation

IHDI and potential IHDI

Inequality adjustment used below in estimation

## Properties

$H_1$  satisfies usual properties

Invariance properties via geometric mean used below in  
ensuring robustness to calibration choices

# This Paper

## Implementation

Revisit measurement assumptions (ii-iii)

Calibrating variables

Estimating indices

Potential IHDI  $H_1^*$

Uses aggregate data *arithmetic means*

Combine using geometric mean

IHDI  $H_1$

Geometric means unavailable for aggregate data

Use estimates of Atkinson's inequality measure to adjust mean

Combine using geometric mean

## Example

# Review of FLS

## Notation

- x distribution of income
- y distribution of education
- z distribution of health
- D matrix of achievements

# HDI

$$H(D) = \mu[\mu(x), \mu(y), \mu(z)]$$

Measure of average achievement

Equally distributed equivalent

Assuming welfare has form

$$W(D) = \sum_i \sum_j u(d_{ij}) \text{ with } u \text{ linear}$$

# HDI

$$H(D) = \mu[\mu(x), \mu(y), \mu(z)]$$

## Properties

symmetry in dimensions

symmetry in people

replication invariance

normalization

linear homogeneity

monotonicity

subgroup consistency

## Problem

Like per capita GNI, ignores inequality



# Gini-adjusted HDI

Anand & Sen (1993) and Hicks (1997)

Use Sen welfare index to include inequality **within dimensions**

$$S(x) = \mu(x)[1-G(x)] \quad \text{income}$$

$$S(y) = \mu(y)[1-G(y)] \quad \text{education}$$

$$S(z) = \mu(z)[1-G(z)] \quad \text{health}$$

Note Mean achievement is discounted by inequality

# Gini-adjusted HDI

$$H_G(D) = \mu[S(x), S(y), S(z)]$$

## Properties

Symmetry in dimensions, symmetry in people, replication invariance, normalization, linear homogeneity, monotonicity

## Violates subgroup consistency

$H_G(D)$  rises  $H_G(D')$  rises  $H_G(D;D')$  falls

Gain inequality sensitivity - but at some cost

Not applicable to regional analysis

Also not "path independent"

Results depend on order of aggregation

- people then dimensions vs. dimensions then people

Note Culprit is Gini in Sen welfare measure

Alternatives? Foster, Lopez Calva, Szekely (2005)

# Inequality-adjusted HDI (IHDI)

## Recall

### *Equally distributed equivalent income (ede)*

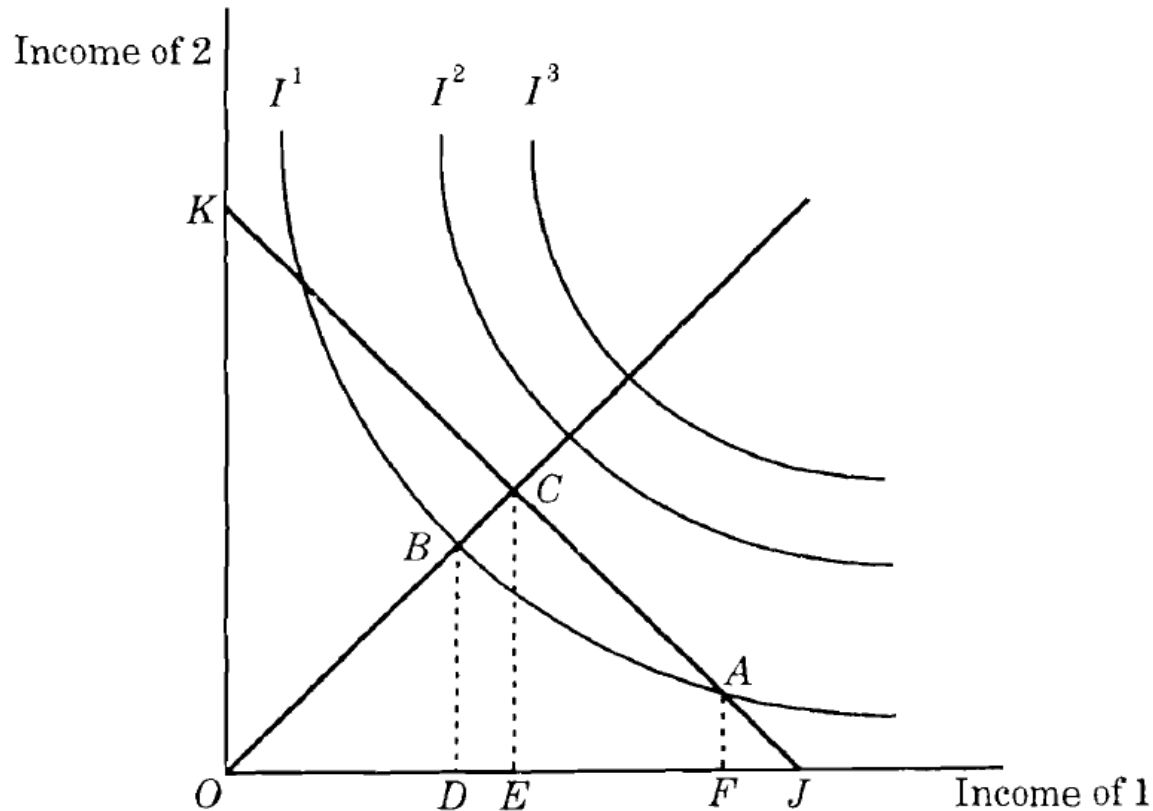
The income level which, if assigned to all individuals, produces the same social welfare as the observed distribution.

## Note

For any  $W(x)$ , the associated ede  $e(x)$  always ranks distribution the same way as  $W(x)$

The ede  $e(x)$  is a welfare function

# Equally Distributed Equivalent (ede)



A = initial income distribution

Three social welfare levels,  $I^1$ ,  $I^2$ ,  $I^3$

Find the following:

Total income

Mean Income

Set of all possible distributions

Equally distributed equivalent income

## Atkinson's ede

$$e_{\alpha}(\mathbf{x}) = \begin{cases} \left[ \frac{1}{n} \sum_{i=1}^n x_i^{\alpha} \right]^{1/\alpha} & \alpha \leq 1, \alpha \neq 0 \\ \prod_{i=1}^n x_i^{1/n} & \alpha = 0 \end{cases}$$

$$e_{\alpha}(\mathbf{x}) = \mu_{\alpha}(\mathbf{x}) \quad \text{general mean}$$

$$A_{\varepsilon}(\mathbf{x}) = [\mu(\mathbf{x}) - \mu_{\alpha}(\mathbf{x})] / \mu(\mathbf{x}) \quad \text{inequality}$$

$$\mu_{\alpha}(\mathbf{x}) = \mu(\mathbf{x}) [1 - A_{\varepsilon}(\mathbf{x})] \quad \text{discounted for ineq}$$

# Inequality-adjusted HDI (IHDI)

$$H_{\varepsilon}(D) = \mu_{\alpha}(D) \text{ for } \alpha > 0, \alpha = 1 - \varepsilon$$

- general mean applied to matrix
- $\varepsilon$  achievement level

$$\varepsilon = 0 \quad H_0 = \mu[D] \text{ usual HDI}$$

$$\varepsilon = 1 \quad H_1 = \mu_0[D]$$

based on geometric mean  $g = \mu_0$   
sensitive to inequality

$$\varepsilon = 2 \quad H_2 = \mu_{-1}[D]$$

based on harmonic mean  $\mu_{-1}$   
even more sensitive

# Inequality-adjusted HDI (IHDI)

$$H_{\varepsilon}(D) = H_0(D)[1 - A_{\varepsilon}(D)]$$

## Note

Inequality adjusted

Which inequalities?

Both within dimensions

And across dimensions

## Interpretation

$H_0$  is highest possible level of  $H_{\varepsilon}$  when one can freely transfer achievements across achievements and dimension

$H_{\varepsilon}$  indicates the actual IHDI

# IHDI

## Properties

Symmetry in dimensions, symmetry in people,  
replication invariance, normalization, linear  
homogeneity, monotonicity

Subgroup consistency



# IHDI

## Alternative definitions

$H_\varepsilon(D) = \mu_\alpha [\mu_\alpha(x), \mu_\alpha(y), \mu_\alpha(z)]$  aggregate within dimensions then across dimensions

$H_\varepsilon(D) = \mu_\alpha [\mu_\alpha(d_1), \dots, \mu_\alpha(d_m)]$  aggregate at individual level then across persons

## Path independence

Conceptual

Empirical - need only  $A_\varepsilon(x)$ ,  $A_\varepsilon(y)$ ,  $A_\varepsilon(z)$  estimates

Note: Dimensions are not perfect substitutes

Measure of complementarity:  $\varepsilon$

Sensitive to uneven growth

Not sensitive to correlations!

See work by Seth (2010)

## Family of Human Development Indices for Mexican States

Ranking	State	H index e=0	State	H index e=3	Ranking
1	Chiapas	0.5735	Oaxaca	0.3654	1
2	Oaxaca	0.5881	Chiapas	0.3797	2
3	Guerrero	0.5968	Guerrero	0.3995	3
4	Veracruz	0.6168	Veracruz	0.4337	4
5	Puebla	0.6232	Zacatecas	0.4401	5
6	Yucatán	0.6239	Yucatán	0.4497	6
7	Michoacán	0.6363	Michoacán	0.4509	7
8	San Luis Potosí	0.6370	Puebla	0.4545	8
9	Hidalgo	0.6449	San Luis Potosí	0.4641	9
10	Zacatecas	0.6482	Durango	0.4708	10
11	Guanajuato	0.6546	Tlaxcala	0.4747	11
12	Tlaxcala	0.6600	Hidalgo	0.4784	12
13	Durango	0.6608	Nayarit	0.4898	13
14	Querétaro	0.6637	Guanajuato	0.4937	14
15	Nayarit	0.6638	Chihuahua	0.5069	15
16	Tabasco	0.6646	Tabasco	0.5094	16
17	Morelos	0.6691	Morelos	0.5139	17
18	Campeche	0.6734	Querétaro	0.5146	18
19	Chihuahua	0.6739	México	0.5185	19
20	Tamaulipas	0.6752	Jalisco	0.5246	20
21	Jalisco	0.6772	Sonora	0.5256	21
22	Quintana Roo	0.6798	Tamaulipas	0.5280	22
23	Sinaloa	0.6817	Colima	0.5428	23
24	México	0.6824	Quintana Roo	0.5438	24
25	Sonora	0.6853	Sinaloa	0.5472	25
26	Colima	0.6884	Campeche	0.5473	26
27	Coahuila	0.6957	Coahuila	0.5637	27
28	Aguascalientes	0.7001	Nuevo León	0.5783	28
29	Nuevo León	0.7021	Baja California Sur	0.5787	29
30	Baja California Sur	0.7038	Aguascalientes	0.5811	30
31	Baja California	0.7176	Baja California	0.6150	31
32	Distrito Federal	0.7403	Distrito Federal	0.6376	32

Source: Authors' calculations using the Mexican Census 2000 sample.

# IHDI

Will focus on  $H_1$  as our key IHDI

$$\begin{aligned} H_1(D) &= g(D) = g[g(x), g(y), g(z)] \\ &= g[g(x), g(y), g(z)] \\ &= g[ \mu(x)[1-A(x)], \mu(y)[1-A(y)], \mu(z)[1-A(z)] ] \end{aligned}$$

where  $A(x) = 1 - g(x)/\mu(x)$  etc is a transform of Theil's second

# IHDI

## Interesting measurement properties

### Individual Scale Invariance

Changing scale of a single variable preserves ranks  
And percentage changes

### Independence of Standardized Values

Normalize to one country's achievements  
Preserves ranks and percentage changes

### Consistency over Time

# IHDI

A second index  $H_1^*$

$$H_1^*(D) = H_1(D^*) = g[\mu(x), \mu(y), \mu(z)]$$

Contrast with

$$H_1(D) = g[ \mu(x)[1-A(x)], \mu(y)[1-A(y)], \mu(z)[1-A(z)] ]$$

Idea

$H_1^*$  is highest possible level of  $H_\varepsilon$  when one can freely transfer achievements across achievements  
= Potential  $H_1$

# IHDI

A reinterpretation

$$\ln H_1(D) = \mu [\ln g(x), \ln g(y), \ln g(z)]$$

$$\ln H_1^*(D) = \mu [\ln \mu(x), \ln \mu(y), \ln \mu(z)]$$

Traditional HDI

$$H_T(D) = \mu [\ln \mu(x), \mu(y), \mu(z)]$$