## Oxford Poverty & Human Development Initiative (OPHI)

Oxford Department of International Development Queen Elizabeth House (QEH), University of Oxford



## **OPHI**

## Research in Progress series 2011

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Oxford Poverty & Human Development Initiative (OPHI), Oxford Department of International Development, Queen Elizabeth House (QEH), University of Oxford, 3 Mansfield Road, Oxford OX1 3TB, UK Tel. +44 (0)1865 271915, Fax +44 (0)1865 281801, <a href="mailto:ophi@qeh.ox.ac.uk">ophi@qeh.ox.ac.uk</a>, <a href="http://www.ophi.org.uk">http://www.ophi.org.uk</a>

OPHI gratefully acknowledges support from the UK Economic and Social Research Council (ESRC)/(DFID) Joint Scheme, Robertson Foundation, Praus, UNICEF N'Djamena Chad Country Office, German Federal Ministry for Economic Cooperation and Development (GIZ), Georg-August-Universität Göttingen, International Food Policy Research Institute (IFPRI), John Fell Oxford University Press (OUP) Research Fund, United Nations Development Programme (UNDP) Human Development Report Office, national UNDP and UNICEF offices, and private benefactors. International Development Research Council (IDRC) of Canada, Canadian International Development Agency (CIDA), UK Department of International Development (DFID), and AusAID are also recognised for their past support.

## TRAINING MATERIAL FOR PRODUCING NATIONAL HUMAN DEVELOPMENT REPORTS

## The Human Development Index (HDI)<sup>1</sup>

**Purpose:** To measure the level of achievements in three basic aspects of human development in a given country.

**Dimensions:** Four indicators belonging to three dimensions: Long and healthy life, knowledge and decent standard of living.

## Versions of the Human Development Index (HDI):

- 1. Human Development Index (HDI): Calculated using globally comparable data, the global HDI compares the situation of countries in the areas of health, knowledge and living standards. It was adapted in the 2010 Human Development Report (HDR), and this primer reflects the newest method.
- **2. Regional or national HDIs:** The HDI may be adapted to local realities, needs and the data available. Its purpose is to assess levels of human development in specific regions or countries in the dimensions most relevant and feasible locally.

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<sup>&</sup>lt;sup>1</sup> This document was compiled with information from a range of Human Development Reports and other publications by UNDP. Diego Zavaleta and Joanne Tomkinson edited source materials for this draft, with support from Sabina Alkire, Melissa Friedman, Gisela Robles Aguilar, Sarah Valenti, Maria Emma Santos, and others at HDRO including Amie Gaye and Tim Scott.

## **HDI: CONTENTS**

- 1. Overview
- 2. Components of the global HDI
  - 2.1 Long and healthy life
  - 2.2 Knowledge
  - 2.3 Decent standard of living
  - 2.4 Aggregation and weights
  - 2.5 Data sources
- 3. Measurement
  - 3.1 Calculating the dimension indices
  - 3.2 Aggregation
  - 3.3 Examples
  - 3.4 Interpretation
  - 3.5 The hybrid HDI for historical analysis
- 4. Potential innovations
  - 4.1 Creating regional, national and sub-national HDIs
  - 4.2 Adapting the HDI Argentina
  - 4.3 New indices Colombia's violence- adjusted HDI
  - 4.4 New indices Costa Rica's security-corrected HDI
- 5. Analysis and data presentation
  - 5.1 Disaggregation
  - 5.2 Trends
- 6. Changes to the HDI and limitations
  - 6.1 Changes introduced in 2010
  - 6.2 Limitations of the HDI
- 7. References

#### 1. OVERVIEW

The Human Development Index (HDI) measures achievements in three aspects of human development: health, education and living standards. The global HDI, first presented in the 1990 *Human Development Report (HDR)*, measures a country's success in achieving the following human development achievements for its citizens: a long and healthy life (using health data), access to knowledge (using education data) and a decent standard of living (using income per capita).

The HDI was introduced as an alternative to conventional measures of national development such as income per capita and the rate of economic growth. While income has the potential to expand people's choices, income per capita is also an imperfect guide to the human development successes of a given country or region. In many instances, countries with higher average incomes do have higher health and educational achievements and consequently a higher HDI. But although there is a definite correlation between income and human well-being, this relationship breaks down in many societies and inter-country comparisons. Many countries, for example, have high levels of income per capita but low levels of other human development indicators (and vice versa), while some countries at similar levels of average income have vastly different levels of human development.

Consequently, the manner in which income is distributed and spent within countries is decisive. Moreover, an excessive obsession with the growth of income per capita can obscure the ultimate objective of enriching human lives. Given the imperfect nature of economic wealth as a gauge of human development, the HDI offers a powerful alternative to conventional measures for measuring well-being and socio-economic progress.

In structure, the HDI is a summary composite index. The breakthrough for the HDI was the creation of a single statistic which was to serve as a frame of reference for both social and economic development. The HDI sets a minimum and a maximum value for each dimension and then shows where each country stands in relation to these values, expressed as a number between 0 and 1.<sup>2</sup> The higher a country's HDI score, the higher its level of human development (and vice versa). The HDI indicators and functional form have evolved over time, most recently in 2010.

The HDI is the oldest and most prominent index of the family of measures present since the first HDR. Its strengths include its transparency, simplicity and popular resonance. Yet its prominence doesn't imply that it is the only possible measure of human development.<sup>3</sup> It doesn't, for example, capture many aspects of life that people value and have reason to value, such as economic, social and political freedom, and protection against violence, insecurity and discrimination. These limitations, as well as the potential of national and regional HDIs to overcome such shortcomings, are explored below. Key changes to the HDI indicators and functional form introduced in 2010 are also explained.

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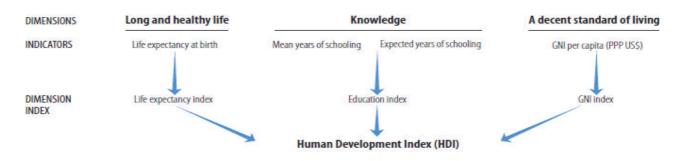
<sup>&</sup>lt;sup>2</sup> This process is known as **normalization**. This refers to the transformation of indicators expressed in different units to quantities taking values between 0 and 1.

<sup>&</sup>lt;sup>3</sup> This is amply is illustrated by the inclusion of the other measures in the *HDR*. The Gender Inequality Index (GII), Inequality adjusted HDI (IHDI), Multidimensional Poverty Index (MPI) and HDI are together a family of human development measures providing complementary information.

#### 2. COMPONENTS OF THE GLOBAL HDI

Since 1990 the HDI has had three dimensions: a long and healthy life, knowledge, and a decent standard of living. The indicators used to inform each dimension have, however, changed over time—most recently in the 2010 HDR (box 2 at the end of the chapter visualizes these changes clearly, and section 6 discusses the refinements introduced in 2010 in greater depth). Four indicators are currently used to inform the three dimensions: life expectancy at birth (long and healthy life), mean years of schooling (knowledge), expected years of schooling (knowledge), and Gross National Income (GNI) per capita<sup>4</sup> adjusted by purchasing power parity (PPP) (standard of living).<sup>5</sup> The knowledge dimension uses two indicators, while the others use just one.<sup>6</sup>

Figure 1. HDI Dimensions and indicators



Source: UNDP (2010). p.215

**Step 1:** The first step of calculating the HDI is to create separate indices for each of the three dimensions. These dimension indices (one for long and healthy life, one for knowledge and one for decent standard of living) are then used to calculate the global HDI. In each of the three dimension indices, a country's achievements are normalized into a score between 0 and 1 using the minimum and maximum values outlined below.

**Step 2:** These three indices are then aggregated to create the global HDI. To do this, you multiply the three dimension indices together and take their cube root. This produces the **geometric mean** of dimension indices.

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<sup>&</sup>lt;sup>4</sup> GNI per capita is "(the) sum of value added by all resident producers in the economy plus any product taxes (less subsidies) not included in the valuation of output plus net receipts of primary income (compensation of employees and property income) from abroad, divided by midyear population. Value added is the net output of an industry after adding up all outputs and subtracting intermediate inputs" (UNDP. 2010. p. 224).

<sup>&</sup>lt;sup>5</sup> Purchasing power parity (PPP) rates of exchange are used to take account of price differences between countries. Unlike market exchange rates (e.g. US\$1 = ChP 486), PPP adjusts the exchange rate to consider variations in prices between countries. This is important because what a person can buy with US\$1 in the United States greatly differs from what ChP 486 can buy in Chile. Through different methods, the exchange rate can be adjusted so that, in theory, 1 PPP dollar (or international dollar) has the same purchasing power in the domestic economy of a country as US\$1 has in the United States economy.

The HDI figures on GNI per capita, adjusted by PPP, are taken from the World Bank's World Development Indicators (for an explanation of how this is calculated see World Bank. 2010. p.35). The HDI is calculated for over 160 countries and areas, all of which have very different price levels. To compare economic statistics across countries therefore, the data must first be converted into a kind of common currency. Adjusting the GNI per capita by PPP US\$ therefore better reflects the living standards of people in each country. However, there are important drawbacks and concerns with the method of adjusting prices by PPP, including problems with measuring the value of non-market services and its urban bias (see UNDP. 2008. p. 8).

<sup>&</sup>lt;sup>6</sup> All three dimensions use indicators which provide an approximate guide to the levels of development in each area. For example, the health data used in the health dimension isn't intended to comprehensively cover all aspects of what would constitute a long and healthy life (such as data on different kinds of diseases). Rather the indicator selected, such as life expectancy at birth, provides a useful "proxy" of how well a country is doing in that particular dimension.

The following three sections introduce the current indicators in each dimension, and the minimum and maximum values that are used in the HDI.<sup>7</sup>

## 2.1 Long and healthy life

The long and healthy life dimension uses life expectancy at birth as its indicator. Life expectancy at birth is: "the number of years a newborn infant could expect to live if prevailing patterns of age-specific mortality rates at the time of birth were to stay the same throughout the child's life" (UNDP. 2010. p. 224). The life expectancy index is calculated using a minimum value of 20 years and maximum value of 83.2 years (see section 3 for details on calculating each dimension index).

The minimum value for life expectancy (20 years) is based on long-run historical evidence from Maddison (2010) and Riley (2005) which shows that if a society or a sub-group of society has a life expectancy below the typical age of reproduction, then that society would die out.<sup>8</sup> The minimum level of 20 years is therefore the life expectancy needed for the subsistence of a society. The maximum value meanwhile is the observed maximum value of the indicator from countries in the time series 1980–2010, and corresponds to Japan in 2010. This time series (1980-2010) is used to determine maximum values for all HDI indicators, plus the minimum value for the standard of living indicator (see below).

#### 2.2 Knowledge

The education component of the HDI is measured by two indicators: mean years of schooling for adults aged 25 years and older,9 and the expected years of schooling for children of schoolgoing age. 10 Estimates for mean years of schooling are based on the duration of schooling at each level of education. Expected years of schooling estimates are based on two factors: enrolment by age at all levels of education and the number of children of school age in the population for each level of education. It is important to note that the duration of each level of education may differ from country to country and this is taken into account when calculating mean and expected years of schooling.

The two indicators are first normalized using a minimum value of 0 and maximum value of 13.2 for mean years of schooling (from the USA in 2000) and 20.6 for expected years of schooling (from Australia in 2002). As societies can subsist without formal education, the minimum value of 0 years is used for both education variables. The maximum values are set to the actual observed maximum values of the indicators from the countries in the time series 1980-2010. Both indicators are then combined to produce an education index, which is the geometric mean<sup>11</sup> of the two equally-weighted sub-indices for each education indicator. The dimensionspecific index for education overall is re-normalized one last time using the minimum value of 0 and the maximum observed value for the 1980-2010 series (0.951 for New Zealand in 2010).

<sup>7</sup> Note that the IHDI uses the same minimum and maximum values as the HDI for its base index, although it uses slightly different indicators to calculate the inequality adjustment factors. See "Training Material for Producing National Human Development Reports: The Inequality-adjusted Human Development Index."

<sup>8</sup> Lower values have occurred during some crises, such as the Rwandan genocide, but these were exceptional cases that were not

<sup>9 &</sup>quot;Average number of years of education received by people ages 25 and older in their lifetime based on education attainment levels of the population converted into years of schooling based on theoretical durations of each level of education attended." (UNDP. 2010. p. 224).

<sup>10 &</sup>quot;Number of years of schooling that a child of school entrance age can expect to receive if prevailing patterns of age-specific

enrolment rates were to stay the same throughout the child's life." (UNDP. 2010. p. 223).

11 To find their geometric mean, simply multiply the two dimension indices together and take their square root. This produces their geometric mean. Box 1 provides a detailed definition and explanation of how to calculate the geometric mean as well as a brief discussion of its advantages with respect to the arithmetic mean.

#### 2.3 Decent standard of living

The decent standard of living component is measured by the natural logarithm of GNI per capita adjusted by PPP. For this component, the minimum value is PPP \$163 which is the lowest value attained by any country between 1980-2010 (in Zimbabwe in 2008). This value was selected as a basic level of income necessary to ensure survival. The maximum value used is PPP \$108,211, again observed during the time series 1980-2010 in the United Arab Emirates in 1980. The HDI uses the natural logarithm of income to reflect the diminishing importance of income with increasing GNI per capita. Thus the index is computed by normalizing the natural logarithm of GNI with respect to the natural logarithm of the minimum and maximum values.

#### 2.4 Aggregation and weights

After calculating the three dimension indices, the scores are aggregated into a composite index using a geometric mean, which is the cube root of the product of the three dimension indices (box 1 explains the geometric mean).

The global HDI assigns equal weight to all three dimension indices, as it has since 1990. The two education "sub-indices" (the indices for each indicator) are also weighted equally (section 6 explains changes to the HDI calculation over time). The choice of equal weights is based on the normative judgement that all three dimensions are equally important. The new HDI has more equal ranges of variation of dimension indices than the previous one, implying that the effective weighting is more equal than it was before.

Within education, both components are now equally weighted. Previously, adult literacy was weighted at 1/3 and school attendance at 2/3. The light weight on adult literacy—a stock variable—is understandable because adult literacy rates provide relatively less accurate information. Adult literacy rates do not discriminate between a person with two years of schooling and a person with a PhD or medical qualification, and in the case of very high HDI countries, barely discriminated among countries. The new indicator "mean years of schooling" better portrays the educational achievements of people 25 years and above and discriminates between countries, hence was given "equal weight."

Alternatively the indicators could be weighted according to the proportion of their populations who are over 25 or "of school-going age"; however, by using equal weighting the HDI is both easier to interpret and also accords more importance to the youth, whose schooling levels are easier to affect and whose educational achievements will influence their own lives and their country for many years to come.

#### 2.5 Data sources

The following data sources were used by the global HDI in 2010.

*Life expectancy at birth*: World Population Prospects 1950–2050: The 2008 Revision (UNDESA 2009), the official source of UN population estimates and projections.

Expected years of schooling: United Nations Educational, Scientific and Cultural Organization (UNESCO) Institute for Statistics. The estimates are based on enrolment by age at all levels of education, and population of official school age for all levels of education.<sup>12</sup>

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<sup>&</sup>lt;sup>12</sup> As previously mentioned, cross-country comparison of expected years of schooling should be made with caution because the length of the school year and the quality of education are not the same in every country and because the indicator does not directly take into account the effects of repetition (some countries have automatic promotion while others do not). Coverage of different types of continuing education and training also varies across countries. Thus, where possible, the indicator should be interpreted in the context of complementary indicators, such as repetition rates, as well as indicators of the quality of education.

Mean years of schooling: Usually from the United Nations Educational, Scientific and Cultural Organization (UNESCO) Institute for Statistics, but in the absence of data on mean years of schooling from this source, the 2010 HDR uses estimates from Barro and Lee (2010). They are presented in six categories: no formal education, incomplete primary, complete primary, first cycle of secondary, second cycle of secondary, and tertiary. Barro and Lee use country-specific information about duration of schooling at each level to calculate the estimates.

GNI per capita: The World Bank's World Development Indicators database.

## 3. MEASUREMENT

**Step 1:** The first step in calculating the HDI is to create the dimension indices for the three dimensions. This is done by normalizing the indicators into indices whose values range from 0 to 1, using the minimum and maximum values outlined above.

Step 2: The overall HDI is then calculated by taking the geometric mean of normalized indices measuring achievements in each dimension. Because the geometric mean is used for aggregation, the maximum value does not affect the relative comparison (in percentage terms) between any two countries or periods of time. The minimum values will affect comparisons, so values that can be appropriately conceived of as subsistence values or "natural" zeros are used.

#### Box 1. The geometric mean

The geometric mean is a particular case of the family of "general means." The attribute can be income or any other cardinal variable. <sup>13</sup> Given the distribution of an attribute x among n people:

$$x = (x_1, x_2, ...., x_n)$$

The general mean is defined as follows:

$$\mu_{\alpha}(x) = \begin{cases} \left(\frac{(x_1)^{\alpha} + (x_2)^{\alpha} + ... + (x_n)^{\alpha}}{n}\right)^{1/\alpha} & \text{for } \alpha \neq 0 \\ \left(x_1 \times x_2 \times ... \times x_n\right)^{1/n} & \text{for } \alpha = 0 \end{cases}$$

When  $\alpha > 1$ ,  $\mu_{\alpha}$  gives more weight on higher values of  $x$ .

When  $\alpha < 1$ ,  $\mu_{\alpha}$  gives more weight on higher values of  $x$ .

A particular case is when  $\alpha = 0$ . This is called the **geometric mean**—it has a different formula, and is used in the formulation of the HDI and the IHDI.

- When  $\alpha=$  1,  $\,\mu_{\alpha}\,\,$  is arithmetic mean.
- When  $\alpha > 1$ ,  $\mu_{\alpha}$  gives more weight on higher
- the **geometric mean** it has a different formula, and is used in the formulation of the HDI and the

When the coefficient  $\alpha$  equals 1, the general mean is called the **arithmetic mean** and takes the form of a simple average (the sum of all the elements of the distribution divided by the total number of elements in the distribution). In other words, the mean is the amount of income or any other attribute that each person would have if the total amount were perfectly equally distributed.

When  $\alpha < 1$ , the general mean places more weight on its elements with lower values, in effect, penalizing for the existing inequality within the distribution. When there is no inequality within the distribution, the general mean with any  $\alpha \neq 1$  coincides with the arithmetic mean ( $\alpha = 1$ ). However, whenever the elements are unequally distributed within the distribution, the general mean with  $\alpha < 1$  will be lower than the arithmetic mean. The **geometric** mean is a particular

<sup>13</sup> Cardinal variables are those whose quantitative values have a meaning in themselves and are not mere categories, as is the case for ordinal variables. For example, an income of 10 means that a person's income is 10 monetary units.

case with  $\alpha = 0$ . Its multiplicative form is easier to interpret in comparison to the other general means for  $\alpha < 1$ . In addition, the geometric mean satisfies several useful properties.

When  $\alpha > 1$ , the general mean places a higher weight on the elements with larger values in the distribution. This implies that the final result will be leaning towards the higher end of the distribution. The general means within this range of  $\alpha$  are not used for welfare evaluations because they "reward" existing inequality.

The following example illustrates the basic differences between the arithmetic, the geometric and other general means. Imagine the following three distributions, each having three elements:

- Distribution A = (0.1, 0.5, 0.9)
- Distribution B = (0.2, 0.6, 0.7)
- Distribution C = (0.5, 0.5, 0.5)

The arithmetic mean (when  $\alpha = 1$ ) is the sum of the three elements of each distribution divided by the total number of observations. Thus, the arithmetic means of the three distributions are:

- Arithmetic mean of A or  $\mu_1(A) = (0.1 + 0.5 + 0.9)/3 = 0.5$
- Arithmetic mean of B or  $\mu_1(B) = (0.2 + 0.6 + 0.7)/3 = 0.5$
- Arithmetic mean of C or  $\mu_1(C) = (0.5 + 0.5 + 0.5)/3 = 0.5$

The geometric means (when  $\alpha = 0$ ), in turn, are:<sup>14</sup>

- Geo Mean of A, or  $\mu_0(A) = (0.1 \times 0.5 \times 0.9)^{1/3} = 0.36$
- Geo Mean of B or  $\mu_0(B) = (0.2 \times 0.6 \times 0.7)^{1/3} = 0.44$
- Geo Mean of C or  $\mu_0(C) = (0.5 \times 0.5 \times 0.5)^{1/3} = 0.5$

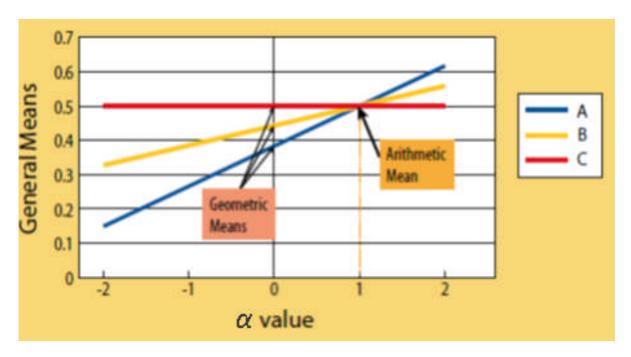
Note how the averages have changed and the geometric mean of A is the lowest due to the higher inequality of its distribution, followed by B. The geometric and the arithmetic means for C coincide because there is perfect equality within this distribution.

The general means for lower values of  $\alpha$ , such as  $\alpha = (-1)$ , will be even lower for A (the most unequal of the three distributions above) and B, but will be equal to the arithmetic mean for distribution C.

The means produced by different  $\alpha$  for each distribution are depicted in the following graph. As can be observed, because distribution C is perfectly equal, all general mean values, regardless of the value of  $\alpha$ , are the same and equal to the arithmetic mean. Contrastingly, distributions A and B have the same arithmetic mean as C but have lower general mean values for  $\alpha < 1$  — the lower the value of  $\alpha$ , the lower the value of general means. Also, for each  $\alpha$  in the range of  $\alpha < 1$ 

<sup>&</sup>lt;sup>14</sup> The geometric means may also be written Geo Mean (A) =  $\sqrt[3]{(0.1)(0.5)(0.9)}$ , Geo Mean (B) =  $\sqrt[3]{(0.2)(0.6)(0.7)}$  and Geo Mean (C) =  $\sqrt[3]{(0.5)(0.5)(0.5)}$ 

1, the general mean value of A is lower than the general mean value of B because distribution A has higher inequality.



Source: Alkire and Santos in Deneulin and Shahani. 2009. p. 131 (with modification to the notation).

This example clearly shows the advantage of using the geometric mean instead of the arithmetic mean for the HDI calculations. The geometric mean penalizes inequality in achievements across dimensions. In fact, the three distributions A, B and C above can also be seen as dimension indices of the HDI. If there are high inequalities between achievements in income as compared to achievements in health and education, this will yield a lower HDI than if —having the same average achievement —the results are about the same in all three dimensions, as it is the case of distribution C.

Note this result rests on strong assumptions about the dimension indices, in particular that a particular value (say 0.5) of each index corresponds to an equivalent level of human development, and that unequal values (say 0.4 and 0.6) correspond to distinct levels of achievement across dimensions.

Beside the fact that the geometric mean captures inequality within elements of a distribution, there is a second advantage of the geometric mean over the arithmetic mean. The arithmetic mean formulation treats the dimensions as perfect substitutes for each other by assuming that a decrease in one element of a distribution can be compensated by an equal increase in any other element, to yield the same level of overall achievement. This aspect is important when comparing the overall achievement across different periods of time. Consider distributions A and C above and imagine that distribution A has been obtained from distribution C by reducing the first element by 0.4 units, from 0.5 to 0.1, but increasing the third element also by 0.4 units, from 0.5 to 0.9. If the arithmetic mean is used to assess the overall achievement, then this would reflect no change in the overall achievement. However, if the geometric mean is used instead to evaluate

<sup>&</sup>lt;sup>15</sup> The same technique is used by the Inequality-adjusted HDI (IHDI), which takes this process one step further. While the HDI penalizes for inequality between dimensions, the IHDI penalizes for both **inequality across dimensions** and **inequality across people within each dimension** (the chapter on the IHDI gives a fuller explanation of this process).

the level of overall achievement, then this would reflect a lower overall achievement for distribution A. The geometric mean requires a larger improvement in one element to compensate for a loss in another element. Thus, if we need to retain the level of overall achievement unchanged at, say 0.5, then compensating for a 0.4 units loss in the first element would require more than 0.4 units of improvement in another dimension(s). (Box ends here)

#### 3.1 Calculating the dimension-specific indices

The boundaries used for each indicator (plus the values used in the combined education index) of the global HDI in 2010 are summarised in table 1 below.

Table 1. Minimum and maximum values

Dimension	Observed maximum	Minimum
Life expectancy	83.2 (Japan, 2010)	20.0
Mean years of schooling	13.2 (United States, 2000)	0
Expected years of schooling	20.6 (Australia, 2002)	0
Combined education index	0.951 (New Zealand, 2010)	0
Per capita income (PPP \$)	108,211 (United Arab Emirates, 1980)	163 (Zimbabwe, 2008)

Source: UNDP (2010). p.216

Having first defined the minimum and maximum values, the dimension-specific indices are then calculated as follows:

### Equation 1: HDI dimension index calculation

Dimension index = 
$$\frac{\text{actual value} - \text{minimum value}}{\text{maximum value} - \text{minimum value}}$$

For **health**, equation 1 is applied using the actual value (the value observed in the country) and the minimum and maximum values presented in the table.

For **education**, equation 1 is applied to each of the two sub-components, then a geometric mean of the two sub-indices is created. In a second step, equation 1 is reapplied to the geometric mean of the two sub-indices, using 0 as the minimum and, as the maximum, the highest geometric mean of the resulting indices for the time period under consideration (0.951).

For income, equation 1 is modified to incorporate the natural logarithm (ln) of all entries:

## Equation 1.1: HDI index calculation for income

Dimension Index = 
$$\frac{\ln[\text{actual value}] - \ln[\text{minimum value}]}{\ln[\text{maximum value}] - \ln[\text{minimum value}]}$$

The natural logarithm is taken because the transformation function from income to capabilities is likely to be concave (Anand and Sen. 2000). The logarithmic transformation has the effect of lowering the contribution of very high incomes to human development.

#### 3.2 Aggregation

The HDI is the geometric mean of the three dimension indices. This can be done in two orders and will yield the same answer. One way is to first multiply the three sub-indices together (this parallels how the previous arithmetic HDI added up the three sub-indices). Next, you take the cube root of the product (this parallels how the previous arithmetic HDI divided the sum of the sub-indices by 3).

A second way is to first take the cube root of each of the dimension indices. The cube root is the number which, if raised to the exponent of 3, or if multiplied by itself three times total, will yield the number you have started with. For example, the cube root of 8 is 2, because  $2 \times 2 \times 2 = 8$ . Next, you simply multiply the three cube roots of the three HDI dimension indices together. This produces the HDI. The aggregation formulae for the HDI are shown in equation 2.

## Equation 2: Aggregation formula for HDI

$$HDI = \sqrt[3]{I_{\textit{health}} \times I_{\textit{education}} \times I_{\textit{income}}}$$

Equation 2 embodies imperfect substitutability across all HDI dimensions. In this way, it addresses one of the most serious criticisms of the previous linear aggregation formula, which implied that all dimensions were perfect substitutes. With this new formula, some substitutability is allowed, but not perfect substitutability as was the case in the old HDI. 16

### 3.3 Examples

This section illustrates how the HDI was calculated for one country—in this case, Argentina. Table 2 presents the actual values of Argentina's four indicators.

Table 2. Indicator values for Argentina

Indicator	Argentina
Life expectancy at birth (years)	75.7
Mean years of schooling (years)	9.3
Expected years of schooling (years)	15.5
GNI per capita (PPP US\$)	14,603

Note: Values are rounded.

## Step 1: Calculating each dimension index

The first step is to calculate each dimension index using equation 1 with Argentina's actual values for each index.

For the life expectancy index:

Life expectancy index = 
$$\frac{\text{actual value - minimum value}}{\text{maximum value - minimum value}}$$
$$= \frac{75.7 - 20}{83.2 - 20} = 0.8813$$

<sup>&</sup>lt;sup>16</sup> See section 6 for a discussion of the new features of the 2010 HDI.

Where 75.7 corresponds to the actual value of life expectancy at birth in Argentina, and 83.2 and 20 correspond to the maximum and minimum values for life expectancy presented in table 1.

For the education index:

The first step is to calculate each sub-index using **Equation 1** with Argentina's actual values:

Means years of schooling index = 
$$\frac{9.3-0}{13.2-0}$$
 = 0.7045

Expected years of schooling index = 
$$\frac{15.5-0}{20.6-0}$$
 = 0.7524

Where 9.3 and 15.5 correspond to the actual values of mean years of schooling and expected years of schooling in Argentina respectively (from table 2); the other values correspond to the maximum and minimum values for both indicators presented in table 1.

The second step is to calculate the education index using equation 1. Here, the "actual" value is the geometric mean of the two subindices:

Actual value = 
$$\sqrt{\frac{\text{(Mean years of schooling index)} \times}{\text{(Expected years of schooling index)}}}}$$
  
=  $\sqrt{0.704 \times 0.752} = 0.728$   
Education index =  $\frac{\text{actual value - minimum value}}{\text{maximum value - minimum value}}}$   
=  $\frac{0.728 - 0}{0.951 - 0} = 0.7651$ 

For this, the geometric mean of the values of the sub-indices is used as the actual value (the geometric mean of X and Y), and 0.951 and 0 correspond to the maximum and minimum values for the education index presented in table 1.

For the income index:

Income index = 
$$\frac{\ln[\text{actual value}] - \ln[\text{minimum value}]}{\ln[\text{maximum value}] - \ln[\text{minimum value}]}$$
$$= \frac{\ln[14,603] - \ln[163]}{\ln[108,211] - \ln[163]} = 0.6918$$

Where 14,603 corresponds to the actual value of GNI per capita (PPP US\$) in Argentina, and 108,211 and 163 correspond to the maximum and minimum values for GNI per capita (PPP US\$) presented in table 1.

#### Step 2: Aggregating the dimension indices

The second step to produce the HDI is the aggregation of the dimension indices. For this, the geometric mean of the three dimension indices is used:

$$HDI = \sqrt[3]{0.8813 \times 0.7651 \times 0.6918} = 0.7754$$

#### 3.4 Interpretation

The HDI was created to emphasize that people and their capabilities should be the ultimate criteria for assessing the development of a country, not economic growth alone. The HDI can also be used to question national policy choices, asking how two countries with the same level of income per person can end up with such different human development outcomes. For example, the Bahamas and New Zealand have similar levels of income per person, but life expectancy and expected years of schooling differ greatly between the two countries. New Zealand as a result has a much higher HDI score than the Bahamas. Such striking contrasts can directly stimulate debate about government policy priorities.

#### 3.5 The hybrid HDI for historical analyses

The hybrid HDI is a version of the index that was calculated in 2010 in order to use historical data. It uses the new aggregation formula introduced in 2010, but to allow for historical analysis, it uses the four indicators used before the 2010 changes (see section 6 for a detailed explanation of the 2010 changes to the way the HDI is measured).

Table 3 shows how differences between the HDI and hybrid HDI using the example of Argentina.

Table 3. HDI and hybrid HDI for Argentina

HDI for Argentina	Hybrid HDI for Argentina	Differences
Life expectancy index $= \frac{75.7 - 20}{83.2 - 20} = 0.8813$	Life expectancy index = $\frac{75.2 - 43.4}{82.7 - 43.4}$ = 0.8091	Minimum and maximum values
Means years of schooling index $= \frac{9.3 - 0}{13.2 - 0} = 0.7045$	Adult literacy rate = $\frac{97.6 - 26.2}{100 - 26.2}$ = 0.9674	New vs. old indicators
Expected years of schooling index $= \frac{15.5 - 0}{20.6 - 0} = 0.7524$	Enrolment ratio in education $= \frac{88.6 - 25.5}{114.2 - 25.5} = 0.7113$	New vs. old indicator
Education index = $\frac{\sqrt[2]{0.704 \times 0.752}}{0.951 - 0}$ = 0.7651	Education index = $\frac{\sqrt{0.976 \times 0.713}}{0.993 - 0}$ = 0.8400	
Income index = $\frac{\ln 14,603 - \ln 163}{\ln 108,211 - \ln 163}$ $= 0.6918$	Income index = $\frac{\ln[13, 238] - \ln[268]}{\ln[85, 382] - \ln[268]}$ $= 0.677$	Minimum and maximum values
$HDI = \sqrt[3]{0.8813 \times 0.7651 \times 0.6918}$ $= 0.7754$	$HDI = \sqrt[3]{0.809 \times 0.84 \times 0.677}$ $= 0.772$	

As table 3 shows, the hybrid HDI uses the new formula for the HDI but includes the previous indicators (adult literacy rate, enrolment ratio in education and GDP per capita adjusted by PPP) and the previous minimum and maximum values (e.g. 43.4 as the minimum value for life expectancy rather than the current 20).

The 2010 HDR used the hybrid HDI for analysis of historical HDI trends since 1970 since there was much more data available from past decades for the former indicators than for the new indicators added in 2010. The hybrid HDI uses annual data from 1970 to 2010 for 135<sup>17</sup> countries and thus provides a useful tool for analysis of trends and changes over time within and between countries.

#### 4. POTENTIAL INNOVATIONS

The functional form of the HDI is highly flexible and allows the index to be used for multiple purposes. The global HDI is chiefly intended for international comparisons between countries and the rest of the world and thus its dimensions and indicators are fixed across countries. This is useful because it provides policy-relevant information for both national governments and the international community. National teams can also disaggregate the global HDI score for their country to compare different sub-populations or sub-regions within the country, if appropriate data at the level of disaggregation are available. Indeed, the HDI methodology has also highlighted internal disparities within countries, prompting constructive national policy debates.

Yet often HDI indicators (particularly GNI per capita and life expectancy at birth) are not available sub-nationally. Also, countries (or regions) may also want to assess context-specific aspects of human development. In such cases, the formula of the global HDI can be easily applied to an alternative set of indicators for national-level exercises or for regional analyses (to facilitate specific regional comparisons). In this way, the HDI is similar to other well-being, inequality or poverty measures. The methodology and formulae underpinning the index can easily incorporate different (or additional) indicators and dimensions. These adaptations are possible if two important conditions are first met: if data are available and if calculations adhere to sound statistical principles.

Both kinds of exercises—international and national—are extremely valuable in obtaining different and complementary information. Thus, while national teams are encouraged to use the global HDI methodology for international comparisons, they are also urged to design national HDIs that use the indicators that are most relevant to their country's specific needs and goals. National-level exercises may, for instance, provide more accurate information in certain areas because the data limitations imposed by international comparability do not apply.

#### 4.1 Creating national and sub-national HDIs

The HDI that appears in the *HDRs* has been designed for international comparisons. It is only **one** application of the HDI. Indeed, countries are strongly encouraged to innovate when creating national-level HDIs to reflect well-being, social progress and human development.

It is important to stress though that innovation should be consistent with rigorous statistical standards. In particular, HDI adjustments should utilize the same **methods** of **weighting and normalization** as the global HDI, making use of well-justified maximum and minimum values

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<sup>&</sup>lt;sup>17</sup> Some of the countries and territories covered by the HDI lacked historical data and so were dropped from this analysis.

to create an index for any added component and clearly defining the weights.<sup>18</sup> These requirements leave plenty of room for innovation to better reflect the priorities and problems relevant to a country's level of development. Additional adjustments to the HDI could involve:

#### Adding new indicators to dimension indices

Introducing indicators that show short-term changes in human development could be advantageous. As it stands, the global HDI struggles to monitor changes in human development in the short-term because two of its indicators—life expectancy and mean years of schooling—change slowly. To address this limitation, indicators that are more sensitive to short-term changes could be added to the national-level HDI. For example, the life expectancy category could use other health indicators such as the daily caloric intake as a percentage of recommended intake, access to health services, under-five mortality rates or maternal mortality rates. The standard of living component could be adjusted to reflect unemployment, the incidence of income poverty or wealth, and the knowledge component could be adapted to include indicators of the quality of education or skills

#### Adding new dimensions

With only three dimensions, the HDI is limited. Since 1990 additional dimensions have been proposed, including political freedom, the environment, safety from violence, work, cultural liberty, and so on (for details see Alkire 2010). The 2010 HDR website allows users to experiment with adding dimensions to the HDI. And national level HDIs can include additional dimensions. Sections 4.2 - 4.4 provide instructive examples of how countries have incorporated new dimensions.

#### Changing indicator-specific weights or values

National policy priorities may require the customization of indicator-specific weights. For example, a country may want to assign a greater weight to education or health. Moreover, minimum and maximum values can be altered to better reflect national data rather than the international values established for the global HDI. The minimum observed value could, for instance, be the average for the most marginalized group and the maximum the average for the top quintile or decile group.

#### Calculating for sub-national areas

The same innovations are also possible for sub-national levels if the data are available. Such national and sub-national adaptations will greatly enhance the usefulness and versatility of the HDI as an analytical tool for human development. Rather than rigidly using the three components presented in the global HDI, national teams are encouraged to innovate and replace or add new dimensions that better reflect their priorities and the problems associated to their development levels.

Several National HDRs (NHDRs) have **extended** and **adapted** the global HDI to include country-specific indicators. Others have assessed broader aspects of well-being at the national level, creating their **own** *indices*.

## 4.2 Adapting the HDI - Argentina

Argentina's 2002 NHDR<sup>19</sup> provides a useful example of national adaptation of the HDI. After a decade of high economic growth during the 1990s, Argentina entered a severe recession and several years of political instability. In just two years, unemployment had reached record levels

 $^{\rm 19}$  "Contributions to Human Development in Argentina." UNDP Argentina. 2002.

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<sup>&</sup>lt;sup>18</sup> Using the same methods **does not** imply using the same values or equal weights. Each country should define what their maximum and minimum values are and set the weights to their dimensions according to national realities and priorities.

and the poverty rate had doubled. Moreover, the analysis of the effects of the crisis unmasked severe inequalities between regions and between the urban and rural areas.

The team putting together the 2002 Argentinean NHDR set out to adapt the global HDI and develop an index that could better inform public policy in this context. The creators of the index sought to capture the effects of Argentina's rapid changes while also taking account of the more structural inequalities in the country. To this end, new indicators were added to each of the thenglobal HDI's dimensions.<sup>20</sup>

In the knowledge dimension, two new indicators were added alongside adult literacy and gross enrolment rates:

- A "quality of education" indicator based on the evaluation of test results in mathematics and Spanish (the official language).
- The over-age enrolment rate (the percentage of students older than the expected age at the school year in which they are enrolled).

The new indicators better reflected the disparity in educational achievements in a country where primary educational enrolment had already been achieved in urban areas (which represented over 90 per cent of the total population).

In the health dimension, a new indicator—infant mortality rate due to reducible causes—was added alongside the life expectancy at birth indicator. This indicator refers to the proportion of deaths of children younger than one attributable to reducible causes accounted in one year (and divided by the total number of children born alive in the same year and multiplied by one thousand).

In the decent standard of living dimension, employment and unemployment rates were introduced next to GDP per capita.

All of the additional indicators correlated with the global HDI vet allowed for better differentiation between sub-national levels. For example, using the global HDI to compare provinces used to yield a difference of approximately 0.10 between the best province in the year 2000 (Buenos Aires 0.85) and the worst (Formosa 0.75). The extended HDI introduced in 2002 allowed for better observations of the severe differences between the same regions. With the new index, Buenos Aires scored 0.86 and Formosa 0.15.

<sup>&</sup>lt;sup>20</sup> The global HDI indicators changed in 2010. This discussion corresponds to the indicators used during 2002. For an overview of the changes in the HDI indicators, see section 6.2.

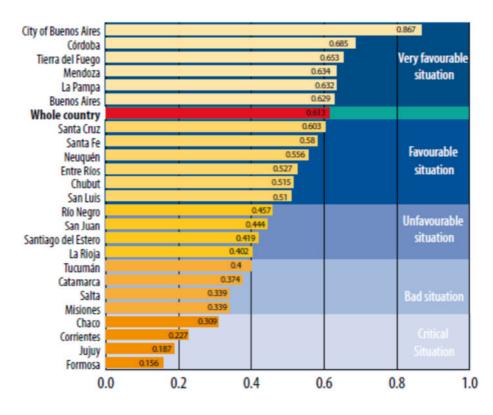


Figure 2. Extended HDI, provinces of Argentina and city of Buenos Aires, 2000

Source: UNDP. 2002. p. 19.

#### 4.3 New indices – Colombia's violence- adjusted HDI

Other countries, meanwhile, have created their own indices. The 2003 Colombia NHDR<sup>21</sup> introduced a new index—the **violence-adjusted HDI**—which sought to demonstrate the effects of armed conflict on people's lives using data on homicide, displacement, crimes committed under conflict, governability and violence. Drawing on social dialogues with communities across the country, it analysed the underlying causes of conflict and identified possible solutions.

#### Features

The **violence-adjusted HDI** used the same indicators and weights as the global HDI for the three standard dimensions—education, health and income. However, the minimum and maximum values used differed as follows:

• Life expectancy: 25 and 85 years

• Income: US \$100 and US\$40 000

• Adult literacy: 0% and 100%

• Gross school enrolment: 0% and 100%.

Th is the rate of homicides per 100, 000 inhabitants. For international comparison, the *th min* (or minimum value) is 0 and *th max* (or maximum value) is 85. For comparison between regions within Colombia, the maximum homicide rate was lower, *th max* = 20, in order to capture the differences among them better.

In addition to the standard HDI dimensions, a new dimension was added which focused on homicide and adjusted the HDI for violence. This dimension-specific index (the **homicide index**) is constructed as follows:

<sup>&</sup>lt;sup>21</sup> "Understand in Order to Transform the Local Roots of Conflict." UNDP. Colombia. 2003.

$$Hom = 1 - \left(\frac{th - th \min}{th \max - th \min}\right) = 1 - \left(\frac{th - 0}{th \max - 0}\right)$$

In the **violence-adjusted HDI**, each of the dimensions are independent as the overall index is composed of the simple average of the dimension indices.

Table 4. Constructing Colombia's violence-adjusted HDI

Country	Dimensions	Indicators	Cut-offs	Weights
Colombia: Violence-adjusted Human Development Index <sup>22</sup>	Four: Income (I) Health (H)	Five: Income (USD, adjusted by PPP) Life expectancy	Standardized with national minimum and maximum values	One quarter per dimension (I+E+H+Hom)/4
	Education (E)	Literacy rate  Gross combined enrolment		
	Violence (Hom)  * Education is the only dimension to use two indicators.	Homicide rate per 100,000 inhabitants		

In addition to the violence-adjusted HDI, the 2003 Colombian NHDR proposed the addition of new indices for displacement, degradation not attributable to war, governability and violence.

## 4.4 New indices – Costa Rica's security-corrected HDI

The 2005 Costa Rica *NHDR*<sup>23</sup> introduced the **security-corrected HDI** which explored the relationship between citizen insecurity and human development. The report responded directly to national public concerns about deteriorating quality of life and the part played by citizen insecurity in those experiences. The goal of the new index was to bring human development concepts and measurement closer to the lives and day-to-day needs of people in Costa Rica.

The report, which won the "Excellence in Human Development Innovations—Concepts or Measurement" prize at the 2007 Human Development Awards, introduced new tools to measure citizen insecurity at the district level, including security (especially violence and theft), perceptions of insecurity and individual liberties. It focused on the specific types of vulnerability caused by violence and dispossession, and the protection of a basic core of fundamental rights.

<sup>&</sup>lt;sup>22</sup> UNDP Colombia. 2003. p. 485.

<sup>&</sup>lt;sup>23</sup> "Overcoming Fear: Citizen (In)Security and Human Development in Costa Rica." UNDP Costa Rica. 2005.

#### **Features**

The report defines citizen security as "the personal, objective and subjective condition of being free from violence or from the threat of intentional violence or dispossession by others." To incorporate this into the HDI, a new dimension was added to the three traditional HDI dimensions. This new dimension, the **cantonal security index** (CSI), revealed differences in the geographical distribution of violence and dispossession within the country. By looking deeper into the situation within Costa Rica's cantons, it showed how victimization and criminality affected people unequally.

In terms of construction, the CSI itself has three indicators:

- Police interventions due to domestic violence (rate per 100,000 people)
- Victims of homicide (rate per 100,000 people)
- Robbery and mugging (rate per 100,000 people)

The dimension index for the CSI is then calculated as follows:

$$CSI = 1 - \frac{PI + H + RM}{3}$$

PI = Police interventions

H = Victims of homicides

RM = Robbery and muggings

The dimensions and indicators used by the **security-corrected HDI** are provides in tables 5 and 6.

Table 5. Constructing Costa Rica's security-corrected HDI

Index	Dimensions	Indicators	Cut-offs	Weights
Costa Rica: Security- corrected Human Development Index <sup>25</sup>	Four: Income (I) Health (H)	Nine:  Purchasing power index (electricity consumption per client standardized)  Life expectancy index (life expectancy, gross mortality rate, proportion of population 65 years or older)	UNDP standard minimum and maximum values were used, except for the health index, where the minimum value used was 50 instead of 0.	One quarter per dimension (I+E+H+CSI)/4
	Education (E)	Knowledge index (2/3 literacy rate and 1/3 global net enrolment)		
	Security (CSI)	Cantonal security index (indicators outlined below)		

<sup>&</sup>lt;sup>24</sup> UNDP Costa Rica. 2005. p.14-15 (English version)

<sup>&</sup>lt;sup>25</sup> UNDP Costa Rica. 2005. p. 515-521 (Spanish version)

Dimension Indicators Cut-offs Weights

Cantonal Three: Each Each indicator is (0.33) and indicator is

Table 6. Cantonal security index in focus

Cantonal Security Index <sup>26</sup> Police interventions (PI): Police interventions due to domestic violence rate per 100,000 people  Victims of homicide (H): Victims of homicide rate per 100,000 people  Robbery and mugging (RM): Robbery and mugging rate per 100,000 people	Each indicator is normalized, using 0 and 1 as its minimum and maximum values.	Each indicator is then weighted a third (0.33) and aggregated to create the index. This is then subtracted from one as follows:  CSI = 1- [(0,33 × PI) +( 0,33 × H) + (0,33 × RM)]

#### 5. ANALYSIS AND DATA PRESENTATION

Despite its simplicity, the HDI provides grounds for varied and powerful statistical analysis. Some of the potential uses and data presentations<sup>27</sup> include:

#### 5.1 Disaggregation

A country's overall HDI ranking can conceal great disparities in levels of human development between different individuals and groups. Disaggregated HDIs provide a window into sometimes highly significant disparities and gaps—gaps among regions, between the sexes, between urban and rural areas and among ethnic groups.

To create a disaggregated HDI, data for each HDI dimension is used for each separate group—in effect, treating each group as if it were a separate country. Such groups may be defined relative to income, geographical or administrative regions, urban or rural residence, gender and ethnicity. Using disaggregated HDIs at the national and sub-national levels can therefore help to guide policy and action to address gaps and inequalities.

Disaggregated HDIs have been used extensively for analysis since their inception, including in countries such as Brazil, Colombia, Egypt, Gabon, Germany, India, Kazakhstan, Malaysia, Mexico, Nigeria, Papua New Guinea, Poland, South Africa, Trinidad and Tobago, Turkey, Ukraine and USA. Recent *NHDRs* in China (2008)<sup>28</sup> and Kenya (2001)<sup>29</sup> have found wide provincial and urban versus rural disparities, while a similar study in Guatemala (2005)<sup>30</sup> has shown that those disparities apply to ethnic groups as well.

Examples findings from disaggregated analysis include:

- In Bolivia, the richest 20 per cent of the population has a HDI rank 97 positions higher than the poorest 20 per cent.
- In South Africa, the top quintile ranks 101 positions above the lowest quintile.

<sup>&</sup>lt;sup>26</sup> UNDP Costa Rica. 2005. p. 513-514 (Spanish version)

<sup>&</sup>lt;sup>27</sup> For an in-depth discussion of potential and innovative ways of presenting HDI data see Hidalgo. 2010.

<sup>&</sup>lt;sup>28</sup> "Access for all: Basic public services for 1.3 billion people." UNDP China. 2008.

<sup>&</sup>lt;sup>29</sup> "Addressing social and economic disparities for human development." UNDP Kenya. 2001.

<sup>&</sup>lt;sup>30</sup> "Ethnic and cultural diversity: Citizenship in a plural state." UNDP Guatemala. 2005.

• In the United States, the top quintile has a HDI value that exceeds all other countries for which the statistic was computed, while the poorest quintile ranks 49 positions lower than the top quintile.

#### 5.2 Trends

A systematic review of patterns and trends in human development reveals powerful insights. The analysis of overall patterns provided in the 2010 HDR sheds light on aspects such as overall tendencies, convergences between countries and strong local variability.

Needless to say, trend analysis requires comparable data through time so some adjustments may be needed. As outlined earlier, the 2010 *HDR* uses a different version of the HDI, the hybrid HDI,<sup>31</sup> to analyse historical trends. An equivalent exercise could also be performed for national-level HDIs.

Some examples of key results from the trend analysis provided in the 2010 HDR are outlined below.

#### Overall trends

Measured in terms of the HDI, progress around the world has been impressive. The world average HDI rose to 0.68 in 2010 from 0.57 in 1990, continuing the upward trend from 1970, when it stood at 0.48. This increase reflects aggregate expansions of about a quarter in the health and education indicators, and a doubling of income per capita. The aggregate global measures are strongly influenced by the most populous countries—China and India. Even so, global figures unweighted by population (and thus reflecting average country performance) show similar progress.

Advances in the HDI have occurred across all regions and almost all countries

The fastest progress has been in East Asia and the Pacific, followed by South Asia, then the Arab States. All but 3 of the 135 countries analysed using the hybrid HDI have a higher level of human development today than in 1970—the exceptions are the Democratic Republic of the Congo, Zambia and Zimbabwe.

The 10 most successful countries in advancing human development come from different regions and initial levels or economic development

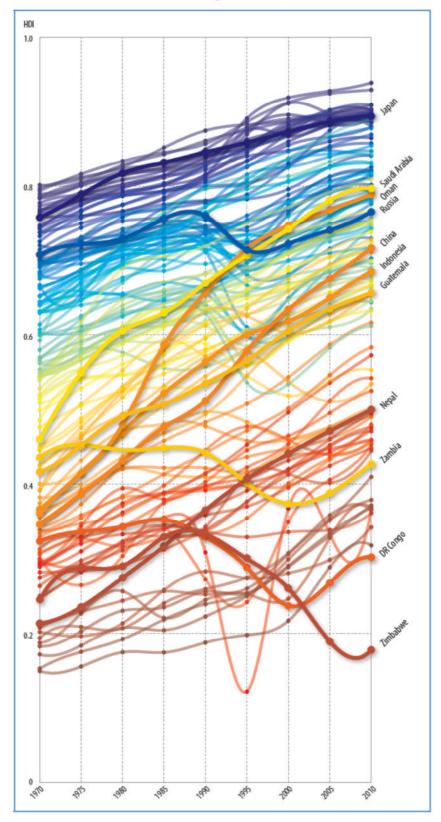
Strikingly, this list contains several countries not typically described as success stories. This is because several countries make it into the top 10 list thanks to their **high achievements in health and education, in some cases even with unexceptional growth performance**. The general lack of overlap between top performers in growth and those in health and education is also remarkable.

The 2010 HDR uses different types of graphics to depict these trends. The following graph illustrates worldwide trends showing the overall progress and the significant variation among countries in terms of human development.

<sup>&</sup>lt;sup>31</sup> The trend analysis for the 2010 HDR (performed using the hybrid HDI) is based on a new dataset of human development trends since 1970, covering 135 countries that account for 92 per cent of the world's population.

Figure 3. Overall progress, significant variability

Worldwide trends in the Human Development Index, 1970-2010



Source: UNDP (2010) p. 27.

#### Convergence

The HDI can be used to assess the gaps between countries, regions or groups. The global HDI, for example, can help assess whether poor countries are closing the gap with rich countries. This question is generally answered by looking at some measure of difference in a specific indicator between poor and rich countries or by assessing whether less developed countries are advancing more rapidly than more developed ones.

Many researchers have investigated this question using GDP as a measure of development. They have generally concluded that the gap is widening. But the HDI tells a more optimistic story. **Overall, poor countries are catching up with rich countries in the HDI.** The HDI gap between developing and developed countries narrowed by about a fifth between 1990 and 2010 (and by about a quarter since 1970). For example, the HDI more than doubled for Mali (from 0.17 to 0.37), Nepal (from 0.22 to 0.50) and Oman (from 0.36 to 0.79). Good news indeed and this occurred despite the large divergence in incomes. **In contrast, incomes show increased divergence**.

On average then, living in a developing country today is more similar—at least for these basic health and education indicators—to living in a developed country than was the case 40 or even 20 years ago. However, this is not true for all developing countries.

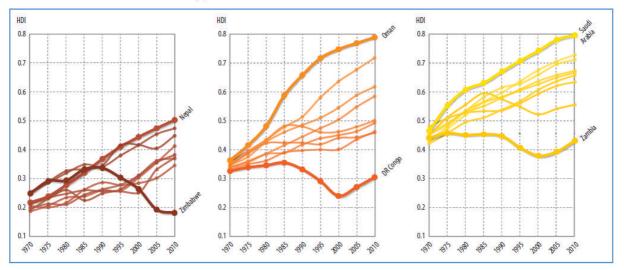
#### Local variability

Not all countries have seen rapid progress, and the variation is striking. Over the past four decades a quarter of developing countries saw their HDI increase less than 20 per cent, while another quarter experienced a more than 65 per cent increase. Since 1990, 10 countries have seen no overall improvement in the HDI. The recent global financial crisis and the East Asian financial crisis of 1997–1998 remind us that progress is not linear, even for countries that perform well. Economic crises can throw countries off track. So can shocks that affect health and education directly, such as epidemics and natural disasters.

To some extent, these differences in rates of progress reflect different starting points—convergence means that less developed countries tend, on average, to improve more rapidly than more developed ones. However, half the variation in HDI progress is unexplained by initial HDI level, and countries with similar starting points experience remarkably different evolutions over time. This evidence suggests that country factors such as institutions, geography and policies—and even pure luck (good and bad)—are important in determining outcomes.

Figure 4. Diversity of paths: Evolution from similar starting points in 1970

Evolution of the HDI from similar starting points in 1970



Source: UNDP, 2010. p.31.

Comparisons with income or economic growth

The HDI can also be used for **comparisons with income levels and economic growth**. For example, comparing the HDI and per capita income ranks of countries, regions or ethnic groups within countries is useful as it highlights the relationship between material wealth on the one hand and human development on the other. A negative gap implies a potential for redirecting resources to human development.

The HDI can also be used to identify how achievements in income growth are related to progress in other HDI dimensions. This can be done by using an index similar to the HDI but calculated with only the health and education indicators to compare changes with economic growth.

Examples of key results comparing income and human development from the  $2010\ HDR$  are discussed below.

Average income growth around the world has been high, but it has been variable across countries, while progress has been more consistent for health and education. Many developing countries have attained levels of health and education similar to those in developed countries, but crossing the divide that separates income-poor from income-rich countries is much harder. Therefore, countries became top performers on the HDI through two broad routes: fast income growth or exceptional progress in health and education.

These findings suggest that over the past 40 years the **forces driving improvements in health** and education are different from those driving improvements in income. Had these processes had the same drivers, the processes would have broadly coincided. But the 2010 *HDR* shows that they did not.

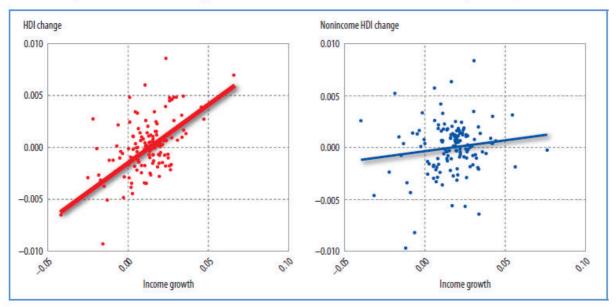
The results of new analysis confirm a central contention of the *HDRs* from the outset: that human development is different from economic growth and that great achievements are possible even without fast growth. The first *HDR* pointed to countries such as Costa Rica, Cuba and Sri Lanka, which had attained much higher human development than other countries

at the same income levels. These achievements were possible because growth had become decoupled from the processes determining progress in other dimensions of human development.

These results also respond to one of the criticisms often levelled at the HDI. From the outset some economists have regarded the non-income dimensions as redundant, because the snapshot of development that the HDI reveals is not systematically different from that emerging from comparing income levels. But the HDI gives a very different picture from GDP when we look at changes over time—and in the end these are precisely the changes that development policy tries to influence.

Figure 5. Weak relationship between economic growth and changes in health and education

Relationship between economic growth and the HDI and its nonincome components, 1970-2010



Source: UNDP, 2010. p.47.

#### 6. CHANGES TO THE HDI AND LIMITATIONS

#### 6.1 Changes introduced in 2010

Improvements are also regularly made to the indicators and functional specifications of the HDI. Reforms resulting from new knowledge reinforce the value and centrality of the HDI as an approach to thinking about development. Better data are also now available for a larger number of countries so new and better indicators can be incorporated. As in past HDRs, the HDI remains a composite index that measures progress in the three basic dimensions of long and healthy life, knowledge and decent standard of living. The 2010 HDR introduced three important kinds of changes to the HDI—changes to indicators, changes to the aggregation method and changes to minimum and maximum values.

#### Changes to indicators

Indicators used in the knowledge and standard of living dimensions were modified in 2010 and are outlined in box 2. One of the dimensions remains the same—long and healthy life—which still uses life expectancy at birth as its indicator. Knowledge was previously measured by a combination of the adult literacy rate and school enrolment rates (for primary through university years). Now it combines the expected years of schooling—the years of schooling that a child can expect to receive given the current enrolment rates—with the mean years of schooling for adults

aged 25 and older. Moreover, equal weights are now assigned to both indicators (one-half). This is different from the previous HDI, which weighted the previous educational sub-indices differently, with adult literacy weighing one-third and enrolment two-thirds. Finally, the decent standard of living dimension was formerly measured by GDP per capita adjusted for PPP US\$ and now uses Gross National Income (GNI) per capita adjusted for PPP.

These modifications have numerous benefits. Mean years of schooling is estimated more frequently for more countries and can discriminate better among countries, while expected years of schooling is consistent with the reframing of this dimension in terms of years. Moreover, literacy—the previous indicator—is a binary variable which doesn't reveal subtle differences within a society. Its capacity to illustrate progress in education had also diminished given that most people, even in the least developed countries, are now literate.

Ideally, measures used in the knowledge dimension would go beyond estimating quantity to assessing quality, as Argentina did and several other national and regional HDRs have done. For example, the 2003 Arab States HDR constructed a measure that captures both the quantity and quality of education, adjusting mean years of schooling with average test scores and including indicators related to media, communication and scientists trained. But good measures of education quality do not exist for enough countries—cross-national assessments of science, mathematics and reading levels of young people are valuable but scarce in coverage and irregular in frequency.

GNI meanwhile better reflects a country's economic welfare. It includes remittances and foreign assistance income providing a more accurate economic picture of many developing countries. It expresses the income accrued to residents of a country, and excludes income generated in the country but repatriated abroad. This is in contrast to GDP which simply accounts for the monetary value of goods and services produced in a country, irrespective of how much is retained in the country. For example, because of large remittances from abroad, GNI in the Philippines greatly exceeds GDP, and because of international aid, Timor-Leste's GNI is many times domestic output.

#### Changes to the calculation method

A key change in 2010 was the shift from an arithmetic mean to a geometric mean (which measures the typical value of a set of numbers) in the calculation of both the overall index and the **education index.** The 2010 HDI is the geometric mean of the three dimension indices. Poor performance in any dimension is now directly reflected in the HDI, and there is no longer perfect substitutability across dimensions.

This method captures how well-rounded a country's performance is across the three dimensions and penalizes for inequality between them. As a basis for comparing achievements, this method is better at respecting intrinsic differences in dimensions than a simple average. It recognizes that health, education and income are all important, but also that it is hard to compare these different dimensions of well-being and that we should not let changes in any of them go unnoticed.

This is important because human development is defined as the expansion of people's freedoms to live long, healthy and creative lives and not as the freedom of people to live long or healthy or creative lives. Each dimension of development is intrinsically important and different. They are not perfect substitutes, as the arithmetic mean implies. At most, they are (quite) imperfect substitutes. The geometric mean reduces the level of substitutability between dimensions and at the same time ensures that a one per cent decline in, say, life expectancy at birth has the same impact on the HDI as a one per cent decline in education or income.

Adopting the geometric mean produces lower index values, with the largest changes occurring in countries with uneven development across dimensions. However, the introduction of the geometric mean has only a moderate impact on the HDI rankings. <sup>32</sup>

The practice of using the log of income is maintained: income is instrumental to human development but higher incomes have a declining contribution to human development. But the new HDI uses the natural logarithm instead of the previously used logarithm with the base of 10. This minor change has no effect on the value of the income index and is motivated by the fact that most of the economic literature uses the natural logarithm of income.

#### Changes in maximum and minimum values

The maximum values in each dimension have also shifted to the **observed maximum**, rather than a **predefined cut-off** beyond which achievements would be ignored. The significance of this change is particularly evident in the income dimension. Previously, a fixed value was assigned to set a "cap" on the standard of living component (at PPP \$40,000). This has now been replaced by an "observed maximum" per capita income level (PPP \$108,211 in the United Arab Emirates).

The cap on the income component of the HDI was lifted for several reasons. The original cap was tied to the understanding that income is instrumental to human development, but that its contribution diminishes as incomes rise. The previous HDI placed the PPP \$40,000 cap on income to reflect the view that beyond some upper set amount, additional income does not expand human development opportunities. A further consideration was that while literacy rates and school enrolment (the indicators used in the previous HDI) and life expectancy have "natural" caps (100 per cent, mortality limits and so forth), the highest incomes would continue rising, skewing the upper ranks of the HDI to increasingly income-driven values and rankings over time.

But countries were increasingly bunched at the cap. This made it hard to distinguish among the increasing number of countries at the top of the distribution (in 2007, for example, the GDP of 13 countries exceeded the cap). Thus, the discriminatory power of capped income has been weakened, especially for discrimination between very highly developed countries. The cap was not originally intended to be binding in the sense of totally disregarding additional income beyond a particular level. For example, the income cap of PPP \$40,000 was not binding on countries when it was introduced in the mid-1990s but rather was an upper bound used to normalize the income dimension index. Moreover, the use of the geometric mean intensifies the diminishing returns of the logarithmic transformation of GNI compared to the arithmetic mean. Finally, and very importantly, the use of real maximum values instead of caps allows the resulting indices to vary in similar ranges so that their implicit weights are more similar than had been the case under the previous method.

In turn, as mentioned before, the minimum levels for the dimension indicators are now set as follows:

- Life expectancy is now set at 20 years, rather than 25. Historical evidence indicates that 20 years as the minimum required for a society to subsist.
- Both education variables are set at 0 (since societies can subsist without formal education).

<sup>&</sup>lt;sup>32</sup> For a further discussion on the effects of the changes on country rankings see Klugman, Rodriguez and Choi 2011a and Zambrano 2011.

• GNI per capita at PPP is now set at \$163, which is the observed minimum (the lowest value attained by any country in recent history—Zimbabwe in 2008—and corresponds to less than 45 cents a day, just over a third of the World Bank's \$1.25 a day poverty line).

The choice of minimum values is motivated by the principle of natural zeros below which there is no possibility for human development. As noted already, this way of normalizing has the effect of making the component sub-indices of these dimensions vary along a similar range.

National HDR teams are advised to regularly consult Human Development Report Office (HDRO) to get updated versions of the minimum and maximum values.

#### 6.2 Limitations of the HDI

Over the past 20 years the HDI has received its share of criticism. Some take issue with its construction and composition. Objections have been raised about, for example, the choice of indicators; the mixture of variables used, which include stock, flow, inputs and outputs; the lack of indicators of quality; the substitutability assumptions; the normalization of indicators; the asymmetric treatment of income; and the choice of weights). Others suggest that it be expanded to include more dimensions, ranging from gender equity to biodiversity. <sup>33</sup> Many concerns are valid. But the objective is not to build an unassailable indicator of well-being—rather it is to redirect attention towards human-centred development and to promote debate over how we advance the progress of societies.<sup>34</sup>

The index does not, for example, capture many aspects of life that people value and have reason to value, such as economic, social and political freedom, and protection against violence, insecurity and discrimination. Important data constraints currently prevent many of these desirable additional dimensions from being incorporated (e.g. political freedom and the absence of discrimination). There are also important conceptual and cultural differences, such as over what constitutes "political freedom" and what would be an appropriate international measure of discrimination.

Yet the HDI is an important step forward. This data gap has been explored in many subsequent investigations of well-being. A sizeable academic literature has since emerged around the HDI and related topics. Regional and national HDRs have also helped narrow this gap for specific contexts by creating innovative measures of human development. The more we discuss what should or should not be included in the HDI—whether it makes sense to lump distinct categories together, how much importance to accord to each category, how to obtain more and better data—the more the debate moves away from the single-minded focus on growth that pervaded thinking about development.

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<sup>&</sup>lt;sup>33</sup> For a detailed review of the criticisms of the HDI see Klugman, Rodriguez and Choi 2011a, 2011b and Kovacevic 2010. See also Ravallion 2010, 2011, Chakravarty 2011 and Zambrano 2011.

<sup>&</sup>lt;sup>34</sup> For a thorough review of the evolution of the definition of human development and the critiques attached to it, see Alkire 2010.

# Final draft (October 2011) HDI: Construction & Analysis Box 2. An evolving measure - changes to the Human Development Index, 1990–2010

HDR	Maximum	aximum Indicators		Treatment of	Dimensional Index Formulas	HDI	
	and minimum values	Health	Education (weights in brackets) [years]	Income	Income		formula
1990	Observed	Life expectancy at birth	Ädult literacy rate [25+]	Real GDP per capita PPP \$ (log)	Logarithmic transformation with a cap set at poverty level	Normalization: =  \[ \frac{Maximum Value - Actual Value}{Maximum Value - Minimum Value} \]  Aggregation of the three dimensional indices: Arithmetic mean	$HDI = 1 - I$ Where $I$ = Average Deprivation Indicator $I = \frac{I_h + I_e + I_y}{2}$
1991– 1993			(2/3) Adult literacy rate (1/3) Mean years of schooling	Real GDP per capita PPP \$ (adjusted)	Atkinson formula* with threshold value derived from poverty line	Aggregation of education indicators: arithmetic mean of un-normalized indicators to produce a measure of educational achievements. The result is then normalized to produce the 'Educational Deprivation Index'.	3
1994	Fixed		(2/3) Adult literacy rate (1/3) Mean years of schooling		Atkinson formula* with threshold y* value being the global average real GDP per capita PPP \$	Normalization: = \frac{Actual Value - Minimum Value}{Maximum Value - Minimum Value}  Aggregation of education indicators: Arithmetic mean of normalized indicators to produce the 'Educational Attainment Index'.	$HDI = I$ Where $I$ = Average Achievement Indicator $I = \frac{I_h + I_e + I_y}{3}$
1995– 1998	Fixed (Minimum value for income reduced from 1994 value).		(2/3) Adult literacy rate (1/3) Combined gross enrolment ratio with a cap starting to bind in 1996				<i>y</i>

HDI: Construction	& Ana	lvsis
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1999			Real GDP per capita PPP \$ (log)	Logarithmic transformation with a cap starting to bind in 2001		
2000– 2009		(2/3) Adult literacy rate [15+]  (1/3) Combined gross enrolment ratio with a cap starting to bind in 1996				
2010	Upper: observed  Lower: Fixed (Minimum value for life expectancy reduced from 2009 value).	(1/2) Mean years of schooling  (1/2) Expected years of schooling	Real GNI per capita PPP \$ (In)	Natural logarithm without a cap	Aggregation of education indicators: geometric mean of normalized indicators to produce the 'Educational Attainment Index', which is then re-normalized.  Aggregation of the three dimensional indices: Geometric mean	$HDI = I$ Where $I$ = Average Achievement Indicator $I = \sqrt[3]{(I_h) \times (I_e) \times (I_y)}$

Source: Authors building on Klugman, Rodriguez and Choi (2011).

This gives:

$$\begin{aligned} & \text{W(y)} = y & \text{for } 0 < y \leq y^* \\ & \text{W(y)} = y^* + 2(y - y^*)^{1/2} & \text{for } y^* \leq y \leq 2y^* \\ & \text{W(y)} = y^* + 2(y^*)^{1/2} + 3(y - 2y^*)^{1/3} & \text{for } 2y^* \leq y \leq 3y^* \end{aligned}$$

and so on.

<sup>\*</sup> The HDI used an explicit formulation to capture the diminishing returns of rising income from 1991 to 1998 based on the Atkinson formulation for the utility of income W(y) =  $\frac{1}{1-\epsilon} \times y^{1-\epsilon}$  (where W(y) is the utility or well-being derived from income, and the parameter  $\epsilon$  measures the extent of diminishing returns). For the HDI, the value of  $\epsilon$  is increased as income rises. For this, the full range of income was divided into multiples of a set poverty line ( $y^*$ ). All incomes below the poverty line were not affected by diminishing returns ( $\epsilon = 0$ ). All incomes above the poverty line were affected in the following way: ( $\epsilon = 1/2$ ) is assigned to incomes between twice the amount of the poverty line; and three times the amount of the poverty line; and so on.

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