# Macro-level drivers of multidimensional poverty in sub-Saharan Africa: Explaining change in the Human Poverty Index

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Poverty is increasingly recognised as a multidimensional phenomenon in the development literature, encompassing not only income, but also a range of factors related to broadening an individual's freedoms to live a life of their own choosing. Poverty so understood suggests that alternative approaches to poverty measurement reflecting this multidimensionality may point towards alternative policies for poverty alleviation. The imperative to reinforce pro-poor policy development in sub-Saharan Africa with evaluation findings that reflect improvements in well-being, rather than solely improvements in national economies, has become self-evident as, despite decades of market-led development policies, much of the subcontinent remains mired in deprivation. As recognised by the 2014 African Evaluation Association's biannual conference, fresh thinking and new evaluation metrics are required in order to create policies that more effectively increase well-being. This article explores the factors that may account for changes in one metric of multidimensional poverty in developing countries, the United Nation Development Program's Human Poverty Index (HPI), and will be primarily concerned with measuring the effects on the HPI of policies and activities that relate to, or are explicitly meant to encourage, economic growth, increased literacy and improved health. The study focuses on the outcomes of a panel data set, created for the purpose of this study, of HPI scores for a set of 47 sub-Saharan countries, between 1990 and 2010, and a range of indicators that the development literature and theory suggest should have an effect on income poverty, asking, what is the relationship between these indicators and multidimensional poverty? A parallel set of models has been developed to measure the response of household consumption expenditure to changes in economic growth and human capabilities indicators. All models are estimated using fixed effects estimators and cluster robust standard errors in Stata 12. Consistent with the development literature, household expenditure appears to be significantly and positively related to changes in gross domestic product (GDP) per capita. However, when the HPI is regressed on GDP per capita, no statistically significant relationship is observed, even when controlling for a range of other indicators, calling into question the relationship between economic growth and well-being in much of sub-Saharan Africa. This finding suggests that development policies that focus primarily on economic growth as a means to addressing multidimensional deprivation may be misplaced.

De plus en plus, la pauvreté est reconnue comme un phénomène multidimensionnel dans les publications relatives au développement, englobant non seulement le revenu, mais aussi une gamme de facteurs liés à l'élargissement des libertés d'un individu de vivre la vie de son choix. La pauvreté ainsi comprise suggère que les approches alternatives à la mesure de la pauvreté prenant en compte cette multidimensionnalité peuvent inspirer des politiques alternatives pour réduire la pauvreté. L'impératif de renforcement du développement de la politique en faveur des pauvres en Afrique subsaharienne avec des conclusions d'évaluations reflétant des améliorations du bien-être, et non pas uniquement des améliorations des économies nationales, est devenu évident puisque, malgré des décennies de politiques de développement orientées vers le marché, une grande part du sous-continent reste embourbée dans le dénuement. Comme l'a reconnu la conférence semestrielle de l'African Evaluation Association (Association africaine d'évaluation) 2014, une nouvelle réflexion et de nouveaux paramètres d'évaluation sont requis afin de créer des politiques qui améliorent plus efficacement le bien-être. Cet article étudie les facteurs qui peuvent être pris en compte en vue de modifications d'un indicateur de pauvreté multidimensionnel dans les pays en développement, l'Indicateur de Pauvreté Humaine (IPH) du Programme des Nation Unies pour le Développement, et se préoccupera principalement de mesurer les effets sur l'IPH de politiques et d'activités qui se lient à la croissance économique, l'alphabétisation accrue et une meilleure santé ou sont explicitement destinées à encourager ces derniers. L'étude se concentre sur les résultats d'un ensemble de données de panel, créées aux fins de cette étude, de scores d'IPH pour un ensemble de 47 pays d'Afrique sub-saharienne, entre 1990 et 2010, et d'une gamme d'indicateurs dont l'effet sur la pauvreté de revenu est suggéré par la littérature et la théorie du développement, en se posant la question suivante : Quelle est la relation entre ces indicateurs et la pauvreté multidimensionnelle ? Un ensemble parallèle de modèles a été développé afin de mesurer la réponse des dépenses de consommation des ménages aux changements de la croissance économique et des indicateurs de capacités humaines. Tous les modèles sont estimés en utilisant des estimateurs à effets fixes et des erreurs-types robustes en grappes dans Stata 12. Conformément aux écrits sur le développement, les dépenses des ménages semblent être significativement et positivement corrélées aux variations du produit intérieur brut (PIB) par habitant. Toutefois, lorsque l'IPH est calculé par régression en fonction du PIB par habitant, aucune relation statistiquement significative n'est observée, même après contrôle d'une gamme d'autres indicateurs, remettant en question la relation entre la croissance économique et le bien-être dans une grande partie de l'Afrique subsaharienne. Cette découverte suggère que les politiques de développement qui s'axent principalement sur la croissance économique comme moyen de traiter la privation multidimensionnelle peuvent se fourvoyer.

# Introduction

It is often said that what gets measured is what gets done, and for the bulk of the international development field's history, poverty has been expressed and measured in monetary terms, such as gross domestic product (GDP) per capita, when discussed at a national or global scale, or the \$1.25 (plus periodic adjustments) per day standard commonly cited in the development literature, when discussed at the individual level. Because poverty is conceptualised as primarily a function of control over monetary resources, policies designed to reduce poverty and improve well-being have tended to focus primarily on economic growth and the expansion of monetary wealth in the developing world.

However, the debate over the appropriate metrics for measuring poverty at a national level has begun to bubble over, leading to the proliferation of multidimensional metrics of poverty that aim to better represent the various components of deprivation. Proponents of these multidimensional poverty indices argue that a change in metrics from unidimensional, monetary-based metrics to multidimensional metrics is critical for the creation of effective international development policy (Alkire & Foster 2011; Anand & Sen 1997; Arimah 2004; Fleurbaey 2009; Kakwani & Silber 2008; Stiglitz, Sen & Fitoussi 2009; Ul Haq 1995).

These multidimensional poverty indices are designed to look beyond monetary-based metrics of development and to identify indicators that better explain how people, rather than economies, are developing. However, properly explaining poverty is, by itself, largely an academic exercise. The point of research on the topic should be to change policy in order to improve the effectiveness of poverty interventions. Underscoring the importance of the connection between sound measurements of social welfare and the policies meant to address them, Fleurbaey (2009:1030) notes:

The practical importance of a measure of social welfare can hardly be overstated. Policy decisions, cost-benefit analysis, international comparisons, measures of growth, and inequality studies constantly refer to evaluations of individual and collective well-being. *The fact that monetary measures still predominate in all such contexts is usually interpreted as imposed by the lack of a better index rather than reflecting a positive consensus.* (emphasis added)

The primary concern of this study is accounting for poverty reduction or increase in sub-Saharan Africa, as measured by the United Nation Development Program's (UNDP) former metric for aggregate, national-level deprivation, the Human Poverty Index (HPI). The HPI was designed to tell a different story than the UNDP's Human Development Index (HDI). The HPI value reflects the proportion of people affected by any one of three key deprivations – adult illiteracy, death before age 40 and a composite measure of the percentage of children underweight for their age and the percentage of a population who lack access to clean water – providing a comparative, multidimensional measure of the prevalence of human poverty (UNDP 2008). Where the HDI measures human development, the HPI measures deprivation; where the HDI examines the progress of a society, the HPI measures the percentage of people left out of this progress.

The HPI is a broad, aggregate measure of how well the poorest of the poor are faring in a given country. Whilst it can be argued that the selection of indicators that comprise the HPI (or any similar multidimensional index) is arbitrary (Alkire & Santos 2009; Basarir 2011; Berenger & Verdier-Chouchane 2007; Ravallion 1992), it would be difficult to argue that these indicators are not metrics of deprivation, or that they are not indicators that are typically used to characterise extreme poverty.

This study is an exploration of those factors that appear to contribute to changes in the HPI and will be primarily concerned with policies and activities that relate to, or are explicitly meant to encourage, economic growth, increased literacy and improved health. In order to draw out the distinctions between factors that drive change in a measure of multidimensional deprivation and those that drive change in unidimensional and income-based metrics of poverty, I will use fixed effects panel models that regress the HPI on various factors reported to reduce income poverty and compare these findings to similar models that regress final household consumption expenditure per capita on those same factors.

The models developed for this study are designed to answer three primary research questions:

- To what degree do economic growth-based policies affect levels of deprivation in developing countries, as measured by the HPI?
- To what degree do human capabilities-based policies affect the HPI in developing countries?

In addition, a related, and perhaps unavoidable, research question has to do with the comparison between how economic growth and human capabilities development strategies relate to a metric of multidimensional poverty and how they relate to a monetary-based metric of poverty, in this case household final consumption expenditure per capita. If one assumes that a monetary-based metric of poverty is an inadequate measurement of human deprivation, then it would be useful to examine how factors that drive change in multidimensional poverty differ, if at all, from those that drive change in monetary-based metrics. This leads to a third research question:

• How do factors that drive change in household final consumption expenditure per capita differ from those that drive change in the HPI?

# Theoretical framework

Whilst the rationale for monetary-based measures of poverty has been evolving since the early part of the 20th century and is extensively covered in the literature (Atkinson 1987; Coudouel, Hentschel & Wodon 2002; Ravallion 1992; Ravallion in Anand, Segal & Stiglitz 2010), arguments for multidimensional poverty metrics have only relatively recently reemerged in the literature. Whilst not yet as welldeveloped as the literature on monetary-based metrics, the literature on alternative methods for measuring development has significantly expanded in recent years.

However, gaps in the literature exist when, instead of examinations of the relationship between monetary-based metrics of poverty and development policies, the relationship between multidimensional metrics and development policies is considered.

Ravallion (1992) draws out the link between measurement and policy by arguing that it is essential that a country's progress towards reducing poverty be reliably measured in order for international financial institutions, regional development banks and bilateral aid agencies 'to have reasonable confidence about the impacts of policy initiatives and reforms on the poor' (p. vii).

Whilst one of the primary objectives of international financial institutions, regional development banks and bilateral aid agencies is to either directly or indirectly reduce the incidence of poverty and improve well-being, the starting point for most of these institutions is a conceptualisation of poverty as seen through the lens of mainstream economic theory, which, to the extent that it addresses it at all, defines poverty as, primarily, insufficient income or command over resources. The policy prescriptions that flow from this formulation are coherent and consistent with this understanding of the root causes of deprivation, particularly as it manifests in the developing world.

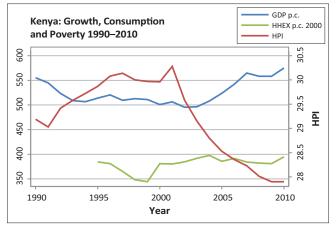
This concatenation of neoclassical economic theory and the policies implemented by donor countries and international financial institutions forms a specific international development regime, one that emphasises economic growth, the generation of wealth and the distribution of that wealth for the purposes of improving well-being.

Dasgupta (1993) neatly summarises the two primary contending positions regarding the measurement of wellbeing and the link between national accounts, such as GDP per capita, and poverty measurement:

If we wish to estimate changes in social well-being, there are two routes available. The first is the direct one. The idea is to measure changes in the constituents of well-being, such as health, longevity, basic liberties, literacy, and also real income, as indicators of the extent of commodity choice. In so doing, we measure changes in well-being itself. ... The other route is roundabout. It is to measure changes in the value of the determinants of well-being. Since commodities are inputs in the production of well-being, we measure changes in the accounting (or shadow) values of goods and services. In short, the idea is to measure changes in real national income. (p. 184)

With nearly 300 citations in other studies, and as recently as May 2012 (according to a search of the Web of Science database on 01 July 2012), David Dollar and Aart Kraay's (2003) study, 'Growth is good for the poor', has proven to be one of the more influential, and contentious, regarding the connection between policies that spur economic growth and income poverty. In it, Dollar and Kraay define the poor as those in the bottom quintile of the income distribution of a country and set about empirically examining the relationship between growth in average incomes of the poor and growth in overall incomes, using a large sample of developing and developed countries between the 1960s and 1990s. Dollar and Kraay (2003:3) report that they find that 'on average incomes of the poor rise equiproportionately with average incomes' and conclude that 'a basic policy package of private property rights, fiscal discipline, macroeconomic stability, and openness to trade on average increases the income of the poor to the same extent that it increases the income of the other households in society' (p. 27).

The charts in Figure 1 and Figure 2 indicate that, in some cases, not only consumption, but also multidimensional poverty behave as Dollar and Kraay would have predicted income poverty to behave. For several sub-Saharan countries, GDP per capita growth moved in tandem with household consumption (but appears to have been preceded



HPI, Human Poverty Index.

FIGURE 1: Kenya growth, consumption and poverty 1990-2010.

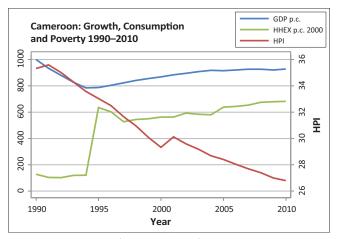


FIGURE 2: Cameroon growth, consumption and poverty 1990–2010.

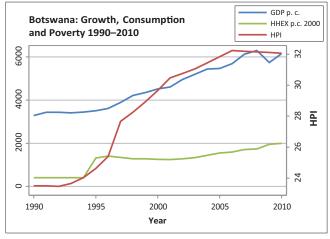


FIGURE 3: Botswana growth, consumption and poverty 1990–2010.

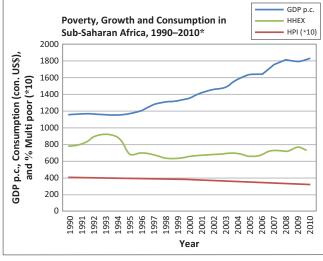
by reductions in multidimensional poverty, as predicted by Ranis, Stewart & Samman 2006). This relationship is illustrated in Figure 1 and Figure 2 by Kenya and Cameroon, but a similar story could be told for others, including Rwanda and Mauritius.

A somewhat different, and more common, picture emerges from the data of countries such as Botswana (Figure 3). In these countries, despite steady growth in GDP per capita over the 21-year period of the study, multidimensional poverty also increases.

When the region as a whole is considered (Figure 4), growth in GDP per capita is followed by only marginal reductions in multidimensional poverty, but also by a small decline in average household consumption expenditure beginning in 1993.

A rejection of well-being and deprivation as concepts reducible to a measure of income, partly illustrated by the graphs above, is reflected in Sudhir Anand and Amartya Sen's (1997) rationale for creating the HPI. In describing the motivation behind the HPI, Anand and Sen argued that the measurement of development had too long focused on the 'conglomerative perspective', a perspective that makes no distinction between the well-off and the deprived. Instead, Anand and Sen proposed that development be measured from a 'deprivation perspective', in which the concern of development is focused specifically on the deprived. By measuring development in this way, Anand and Sen argue that 'lack of progress in reducing the disadvantages of the deprived cannot be "washed away" by large advances - no matter how large - made by the better off people' (Anand & Sen 1997):

'Both the HPI and the income-poverty indicators share the deprivational perspective, but while the latter see nothing in poverty other than the low-ness of incomes, the HPI must take a much broader view, in line with the approach of human development. *It would, in fact, be useful to see how the values and rankings of HPI relate to the results of income-based poverty analysis.*' (p. 1, emphasis added)



\*, Author's calculations

FIGURE 4: Growth, Consumption and Poverty in sub-Saharan Africa, 1990-2010.

Unlike measures of individual or household poverty, the HPI is an aggregate measure of societal deprivation. Unlike the Multidimensional Poverty Index (MPI), which succeeded the HPI as the UNDP's metric of deprivation, the HPI is not easily decomposed by geographic area, ethnicity or other characteristic, but, instead, aims to provide an overarching assessment of a given country's ability to provide for its poorest.

Introduced in the UNDP's (1997) Human Development Report, the HPI remained essentially true to its original formulation<sup>1</sup> until it was replaced in 2010 by the MPI, making possible the comparative analysis to which Anand and Sen (1997) refer, as well as an analysis of how the HPI responds over time to various factors.

#### **Human Poverty Index formula**

$$HPI = \left[\frac{1}{3}\left(P1^{\alpha} + P2^{\alpha} + P3^{\alpha}\right)\right]^{\frac{1}{\alpha}}$$
 [Eqn 1]

P1 = Probability of not surviving to age 40

P2 = Adult illiteracy rate

P3 = Unweighted average of population not using an improved water source and children underweight for age  $\alpha = 3$ 

A country's HPI score equals the proportion of its population affected by any one of these deprivations, providing a comparative measure for the prevalence of deprivation.

Subramanian (McGillivray 2007) notes that income-based measures of poverty are often poor proxies for a capabilities-based definition of deprivation and disparity,

<sup>1.</sup>In 2001, the Human Development Report Office of the UNDP changed the formula used to calculate the HPI by dropping the indicator 'access to health service'. This change in the formula made longitudinal analysis of the HPI that included both data recorded prior to and after 2001 difficult, if not fatally suspect. For the purposes of this study, the HPI has been recalculated for each of the countries included in the analysis between the years 1990 and 2010, using the formula described above.

pointing to China, Costa Rica, Kenya, Peru and the Philippines, 'which have displayed greater success in reducing human poverty than income-poverty'. The experience of these countries points 'to the possibilities of enhancing achievements in the space of human functionings by routes different from those centered exclusively on income growth and the percolation of that growth to the poor' (Subramanian in McGillivray 2007).

### Data and methodology

This study focuses on the outcomes of a panel data set (created for the purpose of this study) of HPI scores for a set of 47 sub-Saharan African countries, between 1990 and 2010 (calculated using the formula above with current data), and a range of indicators that the development literature and theory suggest should have an effect on poverty. Several models have been created to empirically test the relationship between both the HPI and household consumption expenditure and indicators relating to economic growth-based and capabilities-based approaches to development.

Data for this study have been compiled from a range of international development databases, including the World Bank's World Development Indicators, the World Bank's Privatization Database, the Penn World Table, the World Health Organization, the Millennium Development Goals and the International Monetary Fund's International Financial Indicators.

#### **Estimation model**

This article analyses the effects of economic growth and human capabilities-based policies on deprivation, as measured by the HPI, focusing on the primary research question: what is the effect of these policies and interventions on the HPI for selected developing countries? To examine this question, a panel regression model is applied to measure changes in the HPI between 1990 and 2010 for sub-Saharan African countries.

In each model, the dependent variable is either the HPI or household final consumption expenditure per capita. In the economic growth models, the key explanatory variable of interest is GDP per capita, measured in constant international dollars. In the capabilities models, the key explanatory variable of interest is per capita total public expenditure on health, measured in purchasing power parity international dollars. Covariates are included in each model to control for other factors that may drive change in the HPI or household consumption expenditure.

The estimated models are fixed effects models, which control for country-specific unobservable determinants of multidimensional poverty and household consumption expenditure, significant concerns with panel datasets similar to the one that is used in this study. One limitation of using fixed effects estimators is that time-invariant variables, such as geographic characteristics, drop out of the models, making estimations of the coefficients for these variables impossible to determine. Instead, all of the effects of time-invariant factors are absorbed in the error term in fixed effects models. Random effects models are better suited to the use of timeinvariant variables. However, Wooldridge (2006) notes that fixed effects models are the more appropriate models when using panel data to determine policy effects over time.

#### **Dependent variables**

#### **Human Poverty Index**

The HPI, as noted by Anand and Sen (1997), is premised on the understanding of poverty as a multidimensional phenomenon; it was created to provide a fuller accounting of human deprivation than those based simply on some measure of income. The UNDP adopted it and promoted it as a tool for planning and advocacy, as well as a tool for research into changes in multidimensional poverty. Country HPI scores were reported annually in the UNDP's Human Development Report until 2010. The observation of annual changes in HPI scores invites inspection and analysis as to the factors behind them.

# Household final consumption expenditure per capita as a percent of gross domestic product

A central question addressed in this study is whether or not there is a difference in those factors that reduce multidimensional poverty and those that reduce some monetary-based measure of poverty. The question then becomes: which monetary-based measure of poverty should be used? Coudouel, Hentschel and Wodon (2002) make the case, with regard to monetary-based measures of poverty, that consumption expenditure, rather than income, is a more appropriate measure of well-being. They note that consumption is a better outcome indicator, is more accurately measured and more closely reflects standard of living than income. Consistent with Coudouel *et al.* recommendation, I will use household final consumption per capita as the dependent variable against which I will compare findings from the HPI models.

#### Independent variables

The selection of variables for this study is intentionally focused on those that have some relationship to state policy decisions, rather than those that occur naturally (e.g. geography, natural disasters) or those that are more individual in nature (e.g. family size, wages). By focusing on variables that are the result of policy decisions, it is the aim of this report to suggest that state interventions and state policies have, perhaps, as important a role to play in reducing deprivation as do market and civil society actors.

#### **Economic growth-based variables**

Neoclassical economic theory, as well as neoliberal proponents of the Washington Consensus and its various permutations, suggests that opening up to imports and increasing exports, privatising state-owned enterprises or other government assets and implementing exchange rate controls, to name a few, should result in poverty reduction, as measured in GDP per capita and compared to specified poverty levels, as the economies of developing countries grow (Asian Development Bank 2004; Dollar & Kraay 2003). However, whilst a developing country may have managed to increase its GDP per capita over a period of time, it does not necessarily follow that multidimensional poverty, as measured by the HPI, will have declined.

The first growth-based variable considered as a potential driver of the HPI was the broad measure of GDP per capita (Dollar & Kraay 2003; Ferreira & Ravallion 2008). As covariates I include variables for foreign direct investment (Asian Development Bank 2004; Spence 2008), a measure of exports as a percentage of GDP (Todaro & Smith 2003; Zedillo, Messerlin & Nielsen 2005), imports as a percentage of GDP (Castilho, Menendez & Sztulman 2012), the official exchange rate and inflation (Baldacci *et al.* 2004). The inclusion of these last variables as covariates was based on the grounds that openness to trade and prescriptions for keeping inflation and exchange rates low have been central pieces of the toolkit of international financial institutions in recent decades.

#### **Capabilities-based variables**

Human development advocates, however, argue that poverty reduction is as much, if not more, a function of investments in human capability development as it is of economic growth policies. Proponents of capabilitiesbased development place human beings, instead of economies, at the centre of the development enterprise and would point to investments in, and policies that support, improved health care, education and social inclusion as likely to increase well-being and, therefore, address the multidimensional nature of poverty (Fukuda-Parr 2003; Kuklys 2005; Sen 1999).

This argument will be tested by estimating the effect on the HPI of a set of variables that could arguably serve as proxies for increased state-level investments in capabilities. The key indicator of interest is public health expenditure per capita, following Ranis's et al. (2006) findings that increased public sector investment in health is associated with improved human development and economic growth outcomes. The model includes as a covariate the female secondary school enrolment rate, following Lorentzen, McMillan and Wacziarg's (2005) findings of a significant and positive relationship between per capita income and post-secondary school enrolment rates. The model also includes a variable measuring the percentage of women in a given country's parliament, on the grounds that an increase in participation in national parliaments by women may be a proxy for social inclusion of women more broadly in society; what is being tested, by proxy, is the relationship between social inclusion of women and multidimensional poverty (Kabeer 1999).

In addition to these indicators, the labour force participation rate is included as a covariate on the grounds that employment is key to expanding capabilities and improvements in the ability to derive income from labour through employment may have an effect on multidimensional poverty, in addition to household consumption expenditure. To the extent that ownership of livestock assets is a key wealth indicator in many parts of the developing world, changes in livestock productivity may be related to components of the HPI and thus it is included as a covariate (Barrett, Carter & Little 2006; Hoddinott, Rosegrant & Torero 2012). I also include a measure of agricultural productivity as a covariate.

Conceptually, the models are intended to demonstrate that the HPI is responsive to specific policies adopted by, or conditions that exist in, individual countries.

This conceptual model may be presented as an equation:

$$HPI_{it} = f(zg, zc, t) + C_i + E_{it}$$
 [Eqn 2]

The HPI for country *i* at time *t* is explained as a function of *zg*, a vector of economic growth-based variables, *zc*, a vector of capabilities-based variables, and *t*. The model includes a set of indicators  $C_i$  representing the countries in the model. The variable time is key since it will show whether a change in policy contributes to a change in HPI, potentially providing the strongest evidence of 'cause'.

Table 1 also lists the 47 countries included in the analysis and provides means and standard errors for all variables.

Table 1 presents the mean HPI, GDP per capita, household consumption expenditure and health expenditure by country over the course of this study. Mean values range from, at the lower end, Mauritius, with a mean HPI of 11.4%, to Niger, with a mean HPI of 62% over the 21-year period of this study. In terms of GDP per capita, amounts range from a high of approximately \$10 000 per year in the Seychelles, to a low of approximately \$151 in Liberia and Ethiopia. With regard to mean household consumption expenditure per capita, amounts range from a high of \$2 855 in South Africa, to a low of approximately \$120 in the Democratic Republic of Congo. Finally, in terms of health expenditure per capita, amounts range from a low of \$5.82 in Somalia, to a high of \$392 in the Seychelles.

## Panel regression results Economic growth-based variables and household consumption expenditure

Looking first at those variables meant to measure the effect of changes in indicators of economic growth on household consumption expenditure for all countries in the data set, displayed in Table 2, only GDP per capita behaves as predicted by the economic growth literature, with a \$1 increase associated with an approximately \$0.50 increase

#### TABLE 1: Descriptive statistics.

Country	Statistics	HPI	GDP per capita	Household expenditure	Health expenditure
Ingola	mean	38.00676	1572.198	662.939	71.42261
	min	32.8171	993.898	662.939	18.5318
	max	42.7944	2597.05	662.939	236.551
Benin	mean	50.23714	506.7954	388.4086	23.33761
	min	46.93	456.966	355.748	15.704
	max	53	553.657	424.709	34.1686
otswana	mean	28.52286	4608.309	1225.938	252.4214
	min	23.46	3287.74	404.957	124.778
	max	32.24	6295.88	1998.39	465.541
urkina Faso	mean	59.07095	351.9935	344.7539	20.67777
	min	48.12	269.324	168.037	10.7242
				2056.7	
	max	63.43	457.229		39.0964
urundi	mean	36.69524	166.1189	191.5377	11.93213
	min	28.37	143.783	105.799	6.17984
	max	48.06	223.513	307.114	22.5774
ameroon	mean	30.67857	882.9903	489.8898	40.46024
	min	26.8	783.622	102.158	25.1338
	max	35.59	999.742	682.03	63.8344
ape Verde	mean	18.87952	1730.104	836.5801	93.92639
	min	12.37	1095.41	604.304	56.5852
	max	26.79	2764.22	1303.92	147.724
entral African Republic	mean	43.59048	375.3225	919.1033	13.44398
	min	38.68	338.609	300.869	9.88171
	max	49.16	429.755	1759.13	20.1674
had	mean	58.44762	377.8866	344.8925	19.15368
ldu					
	min	50.78	293.121	300.228	10.5731
	max	66.31	529.433	520.192	30.6446
omoros	mean	25.13667	654.3062	481.872	23.47689
	min	20.05	604.771	306.713	11.246
	max	31.15	732.741	657.031	40.4659
ongo, Democaratic Republic of	mean	-	160.9279	119.9105	8.460539
	min	-	118.645	100.85	4.2493
	max	-	297.477	142.065	15.9666
ongo, Democratic Republic of	mean	-	1692.999	342.2916	36.72501
	min	-	1523.05	119.313	21.186
	max	-	1909.83	535.868	68.1003
ote d'Ivoire	mean	42.25286	990.5357	635.5277	45.59092
	min	35.4	932.792	505.795	23.1273
waterial Cuizza	max	47.5	1083.63	772.036	71.8341
quatorial Guinea	mean	29.39524	6810.091	1362	259.4395
	min	25.81	1042.01	339.13	21.8315
	max	30.81	14901.3	2591.95	928.054
itrea	mean	38.2281	229.7326	1194.531	8.607141
	min	29.85	176.675	183.201	6.77898
	max	43.04	275.76	5984.13	12.7115
hiopia	mean	55.19952	151.2346	121.2604	7.605789
	min	47.02	113.008	91.2329	3.80563
	max	61.63	231.314	191.924	15.5477
abon	mean	19.25	6729.48	1568.355	170.7566
	min	14.68	5974.7	145.901	102.365
	max	22.12	7628.72	2440.46	308.669
ambia, The	mean	42.84333	429.0914	584.3809	21.22078
	min	35.86	402.849	329.053	14.493
	max	46.02	466.653	2400.98	26.8417
hana	mean	30.29048	461.9037	387.9343	32.95507
	min	21.75	376.59	345.57	12.3245
	max	35.34	610.194	409.121	68.5272
uinea	mean	54.36571	289.1835	226.354	24.14201
anica	min	50.96	265.043	226.354	17.4678
	max	57.76	311.648	226.354	30.2448

Table 1 continues  $\rightarrow$ 

TABLE 1 (Continues...): Descriptive statistics.

Country	Statistics	HPI	GDP per capita	Household expenditure	Health expenditure
Guinea-Bissau	mean	44.6319	456.529	-	22.57278
	min	35.73	386.533	-	10.6159
	max	52.84	589.765	-	38.2167
Kenya	mean	29.22381	525.5078	379.8887	23.22798
	min	27.9	495.569	344.137	14.0337
	max	30.28	574.853	397.561	35.8385
esotho	mean	27.17286	656.3164	709.3681	47.16788
	min	17	510.689	414.636	22.5697
	max	33.13	879.224	882.423	115.716
iberia	mean	41.59476	151.2246	514.5532	14.48995
	min	35.15	50.0422	189.86	0
	max	48.56	252.955	943.692	41.4482
Nadagascar	mean	-	283.3353	251.2773	11.16307
	min	-	249.068	230.516	6.7362
	max	_	328.417	326.965	17.4782
1alawi	mean	36.64381	214.0624	212.7819	15.45903
Talawi	min	29.84	179.906	186.648	7.13484
	max	42.86	258.058	233.969	28.9889
1ali	mean	58.25191		309.589	24.64392
iun .			398.3281		
	min	50.07	325.84	172.257	14.4131
Asuritania	max	64.22	498.475	370.284	41.179
lauritania	mean	40.14714	680.2131	428.9057	31.33392
	min	33.86	614.603	296.752	19.5969
	max	46.82	801.995	554.792	58.9098
lauritius	mean	11.42762	4458.069	2132.143	222.6586
	min	8.73	3037.46	479.948	126.27
	max	14.49	6320.51	3472.71	464.77
Nozambique	mean	47.36429	257.3155	1114.347	16.56636
	min	42.43	175.888	191.769	7.62147
	max	52.91	380.849	4264.62	26.432
lamibia	mean	21.81952	3226.933	1436.103	188.2075
	min	19.54	2672.81	255.743	105.049
	max	24.44	4073.83	2082	283.505
liger	mean	62.11286	267.2257	2127.638	10.92156
	min	50.95	233.68	192.919	5.21647
	max	68.44	302.852	2809.95	19.4509
ligeria	mean	40.47286	739.474	-	48.73779
	min	39.18	660.179	-	16.1294
	max	42.43	972.546	-	87.6313
wanda	mean	35.81857	249.5331	216.2174	21.99299
	min	26.23	140.254	188.669	8.05469
	max	53.9	352.412	240.447	55.224
ao Tome and Principe	mean	19.58524	749.9515	295.6844	67.08189
	min	15.57	693.966	265.834	37.2379
	max	25.32	812.639	331.688	100.633
enegal	mean	44.51143	710.8468	542.2704	37.44858
0-	min	34.53	634.352	505.047	21.3195
	max	51.08	796.149	585.274	65.7465
eychelles	mean	-	10721.06	644.745	392.6027
,	min	-	8559.97	619.813	297.824
	max	-	13019.6	699.444	458.138
ierra Leone	mean	- 52.12286	313.0867	249.1474	39.82663
	min	44.94	247.121	197.463	19.5077
omalia	max	55.09	373.677	294.565	72.2793
omalia	mean	-	-	314.6906	5.828213
	min	-	-	281.971	3.86027
	max	-	-	335.983	7.43116
outh Africa	mean	19.77381	4946.413	2855.047	356.5637
	min	15.98	4472.49	2621.24	205.277
	max	22.76	5848.04	3300.92	630.926

Table 1 continues  $\rightarrow$ 

#### TABLE 1 (Continues...): Descriptive statistics.

Country	Statistics	HPI	GDP per capita	Household expenditure	Health expenditure
Sudan	mean	32.8081	594.8488	1201.169	36.96776
	min	28.83	438.777	390.314	11.4749
	max	34.72	784.802	3742.66	110.776
Swaziland	mean	31.53429	2213.391	1179.599	128.1826
	min	29.16	1995.8	503.534	58.3248
	max	35.57	2450.83	1727.94	242.682
Tanzania	mean	-	334.0289	462.6241	15.42811
	min	-	278.426	170.297	6.28221
	max	-	451.547	2124.77	36.759
Togo	mean	36.66714	393.398	375.0566	22.57624
	min	33.27	319.663	261.146	13.937
	max	38.03	447.232	466.035	39.1102
Uganda	mean	33.46095	279.4554	234.0452	24.65818
	min	24.07	197.64	169.487	14.7793
	max	41.01	393.149	345.703	44.0065
Zambia	mean	37.19667	622.3303	322.1719	36.90014
	min	33.19	557.147	234.957	17.9974
	max	40.31	741.442	420.153	73.8443
Zimbabwe	mean	32.20048	577.3773	453.202	71.83667
	min	22.6	344.742	325.848	35.7119
	max	38.95	718.418	529.441	98.8542
Total	mean	37.50327	1405.364	730.4627	67.07606
	min	8.73	50.0422	91.2329	0
	max	68.44	14901.3	5984.13	928.054

HPI, Human Poverty Index; GDP, gross domestic product.

#### TABLE 2: Economic growth models.

Variable	Household consumption expenditure	HPI
GDP per capita	0.497†	-0.000268
	(-0.146)	(-0.000287)
Inflation	2.709	0.00246†
	(-2.527)	(-0.000664)
FDI	-6.499	-0.024
	(-10.16)	(-0.0246)
Exports	-0.0627	-0.0426
	(-8.888)	(-0.0507)
Imports	4.729	-0.0171
	(-5.416)	(-0.0308)
Official exchange rate	-0.0773	-0.00098
	(-0.131)	(-0.00115)
Constant	-165.4	40.65†
	(-225)	(-1.629)
Observations	637	821
R-squared	0.09	0.051
Number of countries	43	41

HPI, Human Poverty Index.

<sup>†</sup>, Robust standard errors in parentheses.  $p < 0.01; \ddagger, p < 0.05; \$, p < 0.1$ 

(p < 0.01) in household consumption expenditure. None of the other indicators is statistically significant.

### Economic growth-based variables and the **Human Poverty Index**

Table 2 also presents the results of a panel regression model that regresses the HPI on the same economic growth indicators. Amongst these indicators, only the rate of inflation is statistically significant, with a 1% increase resulting in a modest 0.0025 (p < 0.01) increase in the HPI. None of the other indicators is statistically significant.

#### TABLE 3: Capabilities models.

Variable	Household consumption expenditure	HPI
Food production index	-1.358	-0.0489‡
	(-0.897)	(-0.0188)
Livestock production index	1.557	-0.0520‡
	(-1.576)	(-0.022)
Labour force participation rate	13.18	-0.301
	(-9.181)	(-0.196)
Percentage of women in	-1.625	-0.134†
parliament	(-1.705)	(-0.0425)
Secondary school enrolment	4.041	-0.0629
(female)	(-4.275)	(-0.0707)
Health expenditure per	1.234†	0.0119‡
capita (current US dollars)	(-0.356)	(-0.00476)
Constant	-390.3	69.97†
	-681.5	-13.88
Observations	244	311
Number of country	33	38
R-squared (within)	0.46	0.531

HPI, Human Poverty Index.

<sup>†</sup>, Robust standard errors in parentheses.  $p < 0.01; \ddagger, p < 0.05; \$, p < 0.1$ 

### Capabilities-based variables and household consumption expenditure

Table 3 presents the results of the panel regressions of the HPI and household consumption expenditure on the capabilities-based variables. Using the fixed effects and regressing household estimator consumption expenditure on the set of capabilities-based variables for all countries in the data set finds none of the variables to be statistically significant.

# Capabilities-based variables and the Human Poverty Index

However, when the HPI is considered, several of the indicators are found to be associated with significant reductions in multidimensional poverty. As shown in Table 3, a one unit increase in both the food production index and livestock production index are associated with a 0.05% reduction in the HPI (p < 0.05); each percentage increase in percentage of parliamentary seats held by women is associated with a 0.13% reduction in the HPI (p < 0.01). Curiously, neither the labour force participation rate nor the secondary school enrolment rate amongst girls is statistically significant and an increase in health expenditure per capita is associated with a statistically significant (p < 0.05), but economically insignificant, 0.005% increase in the HPI.

Although small, the relationship between health expenditure per capita and the HPI is anomalous. One possible explanation for this outcome is that the indicator, health expenditure per capita, measures total health expenditure, public and private, and covers the provision of preventative and curative health services, family planning and emergency aid, but not expenditure on water improvement and sanitation (and is assumed to be unrelated to adult illiteracy). Given that access to an improved water source is a principle component of the HPI, and given that water-borne illnesses disproportionately affect the most deprived, it may be the case that increases in total health care expenditure come at the expense of investments in improving water and sanitation. Such a zerosum outcome may account for the positive and significant relationship between total health care expenditure and marginal increases in the HPI, but further analysis of this relationship falls beyond the scope of this study.

# Conclusion

From the outset, the intent of this study has been to determine whether those factors that drive change in an income-based metric of poverty are the same as or different from those that drive change in a multidimensional metric. This is important because, presumably, policy and investment decisions are made based on the evidence of what does and does not work.

Despite claims to have moved into a 'post-Washington Consensus', neoliberal assumptions persist when it comes to policymaking amongst international finance institutions (IFIs) and many bilateral aid agencies; investments in, and loans to, developing countries should be targeted towards economic growth and the resulting wealth will trickle down to the poor, so the argument goes. However, continuing to conceptualise poverty as a function of income, whether national or individual, presents a misleading picture of the effect that development policy has had on the well-being of the poorest.

One example of the persistence of neoliberal influence over development policy can be found in a recent World Bank Independent Evaluation Group (IEG) report on the role and effectiveness of the World Bank's International Finance Corporation (IFC) in terms of poverty reduction. The executive summary of the report, which found the IFC's poverty reduction outcomes lacking, begins with the statement "growth is good for the poor," echoing Dollar and Kraay (2003) and, implicitly, ignoring research that argues for directly investing in the well-being of the poor. In fact, the evaluation of the IFC's efforts between 2000 and 2010 contained a candid admission that:

(IFC) projects are designed to contribute to growth and therefore may have poverty effects. However, it has been challenging for IFC to incorporate distributional issues in interventions. *Fewer than half of projects reviewed included evidence of poverty and distributional aspects in project objectives, targeting of interventions, characteristics of intended beneficiaries, or tracking of impacts.* (IEG 2011, emphasis added)

Why is this statement by the IEG important? IFC investments dwarf those made by its traditional lending instruments, the International Bank for Reconstruction and Development and International Development Association: the Bretton Woods Project (2014) reports that between July 2009 and June 2013 IFC investment in financial intermediaries (largely banking and private equity firms) totalled approximately \$36 billion, or more than three times the amount the rest of the World Bank Group invested in education and 50% more than it invested in health care. Arguably, investments of this magnitude exert a strong influence over national development policy.

Critics of development policy, as promoted by Western bilateral aid agencies and IFIs, note that investments in the developing world proceed on the assumption that growth benefits the rich and poor alike, despite scant evidence supporting this assumption. This study begins from a similar premise and concludes with a similar finding; there are no findings supporting the hypothesis that as a sub-Saharan nation becomes wealthier, in terms of GDP per capita, deprivation is reduced. However, this study finds evidence suggesting that direct investments in livestock and agricultural productivity, and in the social inclusion of women, may reduce multidimensional poverty. These findings support Ranis et al.'s (2006) findings that poverty reduction and sustained economic growth typically occur when investments are first made directly in human development, rather than in economic growth strategies.

Dollar and Kraay (2003) famously reported that growthenhancing policies and institutions 'tend to benefit the poor – and everyone else in society – equiproportionately', and that 'pro-poor' policy interventions, such as those related to primary school attainment, public expenditure on health and education and labour productivity in agriculture, have little to no effect in terms of raising the share of income for the poorest. The findings from this study confirm that economic growth, as measured by GDP per capita, does tend to benefit households, as measured by household consumption expenditure, although not on the 1:1 ratio claimed in Dollar and Kraay's examination of income poverty of the poorest quintile.

However, a closer look at drivers of multidimensional poverty in sub-Saharan Africa would suggest that, in fact, deprivation is considerably reduced by factors other than economic growth, including increases in food production, livestock production and the percentage of women in national parliaments, which may be a proxy for social inclusion and gender equity.

The primary aim of this study has been to identify from amongst the range of potential macro-level drivers those that have an influence on multidimensional poverty. It has as its starting point the premise that poverty is a multidimensional phenomenon and, as a corollary premise, a better understanding of what drives change in a particular multidimensional index – the HPI – would help to shape policies designed to improve well-being, as measured in terms other than monetary.

Growth, as measured by increases in GDP per capita, is not, it would seem, an unalloyed good for the poor, as Dollar and Kraay (2003) argue, if one measures poverty not by lowness of income, but by a multidimensional metric that more closely reflects deprivation. As Stiglitz, Sen and Fittousi (2009) caution, if the metrics used in measuring poverty are wrong, then so, too, will be the inference that we draw about what makes for good policy. From the findings presented above, it would seem that the inferences will vary widely if, rather than an income-based metric, one uses a multidimensional metric to measure poverty.

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#### **Competing interests**

I declare that I have no financial or personal relationship(s) that may have inappropriately influenced me in writing this article.

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