

The international focus on poverty reduction, and better health for poor people, requires improved methods of monitoring changes in the level and nature of poverty over time, and progress in health and education outcomes amongst the poor. This paper provides a critical review of methods for defining and measuring poverty:

- absolute versus relative poverty indicators
- money-metric measures: income and expenditure data
- alternative measures of household welfare (such as asset indices, proxy indicators and poverty mapping)
- next steps for improving information on health outcomes and welfare indicators in household survey tools



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Measuring health and poverty: a review of approaches to identifying the poor

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Abbreviations

BNI	Basic Needs Indicators
CGAP	Consultative Group to Assist the Poor
CHI	CASHPOR House Index
CWIQ	Core Welfare Indicator Questionnaire
CWMS	Core Welfare Monitoring Survey
DFID	Department for International Development
DHS	Demographic and Health Survey
DOTS	Directly Observed Short Treatment Short Course
GHF	Global Health Fund
HIPC	Heavily Indebted Poor Country
IDT	International Development Target
IFI	International Financial Institution
IFPRI	International Food Policy Research Institute
INFHS	Indian National Family and Health Survey
KAP	Knowledge, Attitudes and Practices
LDC	Least Developed Country
LSMS	Living Standards Measurement Study
MDGs	Millennium Development Goals
MFI	Microfinance Institution
ODA	Official Development Assistance
OECD	Organisation of Economic Co-operation and Development
OLS	Ordinary Least Squares
PPP	Purchasing Power Parity
PRSP	Poverty Reduction Strategy Paper
PWR	Participatory Wealth Ranking



Executive summary

Introduction

Poverty reduction is now the overarching objective of the international donor community. In 2000, world leaders issued the Millennium Declaration, setting out eight Millennium Development Goals (MDGs). Targets for the health-related MDGs include: reducing infant and child mortality by two-thirds by 2015; reducing maternal mortality by three-quarters by 2015 and improving access to reproductive health services; halting the increase in incidence of communicable diseases (AIDS, malaria, tuberculosis); and reducing malnutrition by halving the proportion of people who suffer from hunger by 2015.

There is a growing recognition that the health-related MDG targets need to be modified to incorporate an explicit poverty dimension. This concern is reflected in the Department for International Development's (DFID) strategy paper (DFID, 2000) for achieving the health-related MDGs, which outlines a clear commitment to achieving better health for poor people. Given this, there is pressing need for national governments and the global development community to monitor both changes in the level and nature of poverty over time and progress in health and educational outcomes amongst the poor (and the rich). In order to do this, reliable methods to distinguish the poor are needed.

Defining poverty

Before one can identify the poor, it is first necessary to clarify what is meant by poverty. It is widely acknowledged that poverty is a multi-dimensional phenomenon that goes well beyond a narrow lack of material consumption or resources to encompass the psychological pain of being poor, low achievements in education and health, and a sense of vulnerability to external events. Accordingly, there are a wide variety of approaches to its definition and measurement.

Traditionally, economists and policy analysts have focused on money-metric measures of poverty, based on the assumption that a person's material standard of living largely determines their well-being. The poor are then defined or identified as those with a material standard of living as measured by income or expenditure below a certain level – the so-called poverty line. Such an approach is implicit in the first MDG, that is 'to reduce the proportion of the population living on less than US\$1 a day by one half between 1990 and 2015'.

Recognition that monetary measures fail to capture other important aspects of well-being, such as community resources, social relations, culture, personal security and the natural environment, has resulted in the development of a set of complementary indicators which aim to capture human capabilities, including health and education. Such measures are directly reflected in the set of indicators for the health- and education-related MDGs.

Measuring material poverty and identifying the poor

The definition and measurement of poverty is subject to debate and controversy. The level of poverty found at any one time in any one country is critically dependent upon assumptions concerning the choice of welfare indicator (whether to use household income or expenditure), the choice over how to take differences in households' sizes and compositions into account, and the choice of appropriate poverty line to use (absolute or relative – and if absolute, an international standard such as US\$1 a day or a national basket of goods).

Absolute or relative poverty?

There are two main approaches to constructing a poverty line. An absolute approach defines poverty according to a minimum standard of living based on a person's physiological needs for water, clothing and shelter. In contrast, the relative approach defines poverty in relation to a generally accepted standard of living in a specific society at a specific time and goes beyond basic physiological needs.

The two concepts of absolute and relative poverty capture different but equally important dimensions of the poverty problem. On the one hand, it is essential to identify how many people, and which people, are living in households that are unable to purchase or consume a fixed minimum amount of goods and services; i.e. who are living in absolute poverty. On the other hand, it is also crucial to identify those with resources that are so limited as to exclude them from achieving a life-style that at least approaches that enjoyed by the rest of society. Relative poverty lines make most sense in countries where absolute deprivation is not the social norm. A commonly used relative poverty line is that of households living below half-average income.

Most development agencies are concerned with the reduction of absolute poverty. The definition of poverty inherent within the MDG of eradicating world poverty is an absolute one; i.e. one is considered poor if surviving on less than US\$1 per person a day. This international standard was developed by the World Bank in the 1980s and was based on the average of the poverty lines of ten low income countries, all of which were located wholly or in part within the tropics. How we clothe and feed ourselves has changed drastically over the years. So has the state of knowledge about nutritional requirements. Furthermore, climatic conditions in different countries generate different needs, and even within countries individuals vary in their physical requirements. Given these issues, it is questionable whether it is appropriate to have a universal international absolute poverty line – such as the MDG line of US\$1 a day – that is applicable across both time and space.

Although international poverty lines defined in US dollars allow comparison of poverty across countries, they say little about the level of resources considered to represent subsistence needs in any particular country. The US\$1 poverty line should be seen as a supplement to, rather than replacement for, a national poverty line based on a minimum consumption basket that has been calculated and priced specifically for an individual country's own circumstances.

Measuring household welfare

Quantifying the welfare of individuals or households is notoriously difficult. In theory, the best indicator of welfare is the actual consumption of the individual, including food and other goods as well as services such as education and health. In practice, data on income or expenditure are often used as a proxy for consumption.

The choice between income and expenditure is often dictated by data availability and data quality. Key problems include measurement error, both from underreporting and recall bias, difficulties in imputing a cash value to the home production of foodstuffs and in deriving the 'use value' of other goods and services.

Even if a robust measure of material resources can be obtained, disagreements remain over how to account for households of differing sizes and composition. The choice of equivalence scale can significantly alter the profile of poverty.

Given the problems in measuring income and expenditure and the difficulties in determining how, if at all, to adjust for differences in household size and composition, analysts are increasingly concerned to identify alternative measures of household welfare that are robust but less data intensive and subject to smaller measurement error.

Alternative indicators of household welfare are also required in situations where income and expenditure data are absent. This is particularly relevant for analysts interested in monitoring the distributional dimension of progress towards the non-economic-related MDGs, as frequently the surveys that contain detailed information on, for example, health-related outcomes such as infant and child mortality or access to reproductive health services, do not collect information on household incomes or expenditures.

Alternative approaches to measuring household welfare

Recent research using the Demographic and Health Surveys (DHS) has used data on ownership of assets and access to services to derive alternative indicators of household socio-economic status.

From a review of existing studies, it appears that statistically weighted asset-based indices have the potential for providing alternative welfare *rankings* of the population. However, it is important to recognise that their use is strictly limited to providing *relative* analyses of welfare; for example, the characteristics of those households in the bottom 20 per cent of the distribution versus those in the top 20 per cent of the distribution. Asset indices can say nothing about levels of absolute poverty. Nor can they be reliably used to monitor *changes* in poverty over time, as there may be significant changes in household ownership of or access to some of the index components, which may not necessarily translate into a reduction in material poverty.

There also remain real questions as to the veracity of such indices. Studies that have examined the relationship between asset-based indices and money-metric measures of

household welfare have found that the indices are generally poor proxies for current consumption/income and may be better thought of as being proxies for longer term or 'permanent' income.

Valuable lessons for the future development of proxy indicators may be drawn from work in other spheres, including poverty-focused programmatic field interventions, proxy mean-testing and poverty mapping. Participatory Wealth Ranking (PWR), in which communities themselves define who are poor, offers a promising way forward for monitoring the poverty focus of health and other interventions at the local level. Useful insights into alternative components for inclusion in asset-based welfare indices are offered by research carried out by economists and social policy analysts interested in identifying welfare proxies for the purposes of targeting welfare benefits and producing poverty maps. Possible variables include the education and occupation of household members, demographic composition and indicators of food security and vulnerability.

The way forward

The motivation for this paper is to inform discussions between DFID and other donors on possible ways forward to improve the poverty focus of monitoring progress towards the health-related MDGs and other global initiatives, including the Global Fund to fight AIDS, TB and malaria (GHF). The key difficulty in measuring the effectiveness of health interventions in improving the health of the poor is that such analysis requires high quality information on both poverty and health status in the same dataset. One obvious option is to adapt existing tools such as the DHS and Living Standards Measurement Study (LSMS).

DHS information should remain the starting point for measuring the health of the poor. However, it is suggested that future LSMS should at a minimum include questions on self-reported health status (chronic, acute and mental health), utilisation of health services (both primary and tertiary) and, for women of reproductive age, birth history, Knowledge, Attitude and Practice (KAP) survey and use of health services during last pregnancy. Given the importance of private health expenditures in the impoverishment of households, it is also suggested that information on both formal and other out-of-pocket payments related to health care should also be collected.

Over the last five years there has been significant progress on the identification and use of proxy indicators of household welfare within the DHS. However, continuing to focus on the current, fairly narrow, range of asset questions currently included in the DHS is not sufficient and highlights the need for further work on the identification of a set of suitable asset indicators. Issues to be explored should include alternative asset questions as well as indicators of food security and summary money-metric measures.

Additionally, most of the proxies currently used are measured at the household level. However, it is possible for poor individuals to live in rich households and vice versa. Thus, further work focusing on developing suitable welfare rankings for individuals rather than households is also necessary.

Finally, work is needed on ways to improve coverage of the poor, including new areas of settlement and additional surveys for particular target groups such as street children or nomadic groups. A common criticism levied at the measurement of poverty based on household survey data is that they omit several important groups of poor people: the homeless and those in institutions such as orphanages, old peoples' homes and mental hospitals. Household surveys also under-represent other poor population groups such as slum dwellers and internally displaced people living in quasi-permanent refugee camps.

1 Introduction

Poverty reduction is now the overarching objective of the international donor community. In 1996 the Development Assistance Committee of the Organisation of Economic Co-operation and Development (OECD) announced a set of International Development Targets (IDTs), which were subsequently agreed by the entire UN membership (OECD, 1996). First amongst these was a commitment to halve the proportion of people in developing countries living in extreme poverty by 2015. The central focus on poverty reduction was subsequently reaffirmed by the International Financial Institutions (IFIs) in 1999 with the launch of the Poverty Reduction Strategy Paper (PRSP) as the new framework for debt relief and concessional multilateral lending. In 2000 world leaders issued the Millennium Declaration, setting out eight MDGs (see Box 1), with each goal accompanied by numerical targets. DFID, along with the IFIs, has made achievement of these goals a central focus of its activities. Annex 1 shows the current MDGs, the targets set for 2015 and the indicators selected for monitoring (as of September 2001). Targets for the health-related MDGs include: reducing infant and child mortality by two-thirds by 2015; reducing maternal mortality by three-quarters by 2015 and improving access to reproductive health services; halt the increase in incidence of communicable diseases (AIDS, malaria, tuberculosis); and reducing malnutrition by halving the proportion of people who suffer from hunger by 2015.

Box 1: The Millennium Development Goals

- Eradicate extreme poverty and hunger
- Achieve universal primary education
- Promote gender equality and empower women
- Reduce child mortality
- Improve maternal health
- Combat HIV/AIDS, malaria and other diseases
- Ensure environmental sustainability
- Develop a global partnership for development

There is a growing recognition that the health-related MDG targets need to be modified to incorporate an explicit poverty dimension. Work by Gwatkin (2000) and others has highlighted that without such a distributional component it would be possible in principle for the targets to be achieved without addressing the needs of the poor at all. For example, it would be theoretically possible in some countries to reduce overall infant mortality rates by two-thirds, with all the improvements being concentrated in the richest sections of the population and without any improvement in the health of the poor. The DFID strategy paper for achieving the health-related MDGs reflects this concern, outlining

a clear commitment to achieving better health for poor people (DFID, 2000). Given this, there is pressing need for national governments and the global development community to monitor both changes in the level and nature of poverty over time *and* progress in health and educational outcomes amongst the poor (and the rich). In order to do this, reliable methods to distinguish the poor are needed.

Before one can identify the poor it is first necessary to clarify what is meant by poverty. Section 2 therefore briefly reviews alternative conceptualisations of poverty. Section 3 then discusses issues in the measurement of material or economic dimensions of poverty. In particular, problems in the collection and measurement of information on household income and expenditure in the context of low income countries are discussed. However, given their prominence in the literature, the strengths and limitations of alternative poverty lines are also examined. Section 4 then turns to an examination of alternative measures of, or proxies for, household welfare. The first part of this section focuses exclusively on recent research on asset indices as a measure of household socio-economic status using data from the DHS. Following this, lessons for the derivation of proxy indicators are drawn from work in other spheres, including poverty-focused programmatic field interventions, proxy mean-testing and poverty mapping. Finally, in Section 5, recommendations are made for the next steps for the continuing development of improved and appropriate methods of identifying the poor using existing survey tools at the country level.



2 Defining poverty

Poverty is a multidimensional phenomena and accordingly there are a wide variety of approaches to its definition and measurement. Traditionally, economists and policy analysts have focused on money-metric measures of poverty, based on the assumption that a person's *material standard of living* largely determines their well-being. The poor are then defined or identified as those with a material standard of living as measured by income or expenditure below a certain level – the so-called poverty line (Atkinson, 1987, 1989; Ravallion, 1992). Practical problems, largely associated with the difficulty of accurately quantifying income or expenditure, have recently led to the exploration of alternative, non-monetary proxies for household welfare by economists. Prominent amongst these is the use of household asset indexes; i.e. an aggregate measure of the access to and ownership of a specified list of household attributes (Filmer and Pritchett, 1998; Montgomery et al., 2000; Sahn and Stifel, 2000).

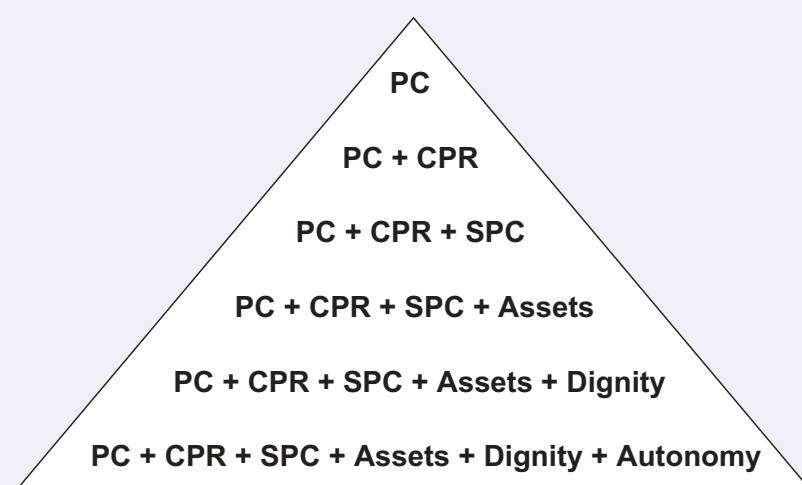
It is increasingly recognised that poverty measures based on household income or expenditure reflect a *static* concept, offering only a limited picture of household well-being. In the face of what might be considered transitory shocks to income, households may reduce the consumption of food or household expenditure on clothing or other items in order to preserve their asset holdings, such as land, housing or durables. If, however, shocks permanently affect welfare, households may run down their holdings of assets such as durables, jewellery, livestock or land. Agarwal (1991), examining the welfare impact of famine in Bangladesh, concludes that focusing exclusively on either asset ownership or food expenditure/nutritional levels/household expenditure may give a misleading picture of well-being. *Vulnerability* and *livelihood strategy* approaches to poverty assessment are seen as offering a more *dynamic* conception of poverty. They focus on the households' ability to cope with shocks to living standards by incorporating measures of investments in human capital (health and education), physical investments (housing, equipment and land), social capital and claims on other assets (such as friendships and kinship networks) stores (food, money or valuables such as jewellery), as well as labour (Moser, 1998; Bond and Mukherjee, 2001). Such approaches may be particularly valuable for exploring the linkages between poverty and health; for example, the role of private household expenditure in the impoverishment of households, or financial costs as a barrier to access to health services amongst the poor.

Theoretical considerations and the recognition that monetary measures fail to capture other important aspects of individual well-being, such as community resources, social relations, culture, personal security and the natural environment, have resulted in the development of a set of complementary indicators which aim to capture *human capabilities* (Sen, 1985, 1987; McKinley 1997; Micklewright and Stewart, 2001). Capability poverty focuses on an individual's capacity to live a healthy life, free of

avoidable morbidity, having adequate nourishment, being informed and knowledgeable, being capable of reproduction, enjoying personal security, and being able to participate freely and actively in society. Material resources at some level are generally necessary for some of these activities, but they are not sufficient. Measures that focus on capability poverty thus incorporate access to public services, assets and employment, as well as money-metric measures which reflect the ability to 'purchase' food, clothing and shelter. Capability poverty can be measured directly in terms of capabilities themselves; for example, the percentage of children who are underweight, or, indirectly, in terms of access to opportunities, or the means of capabilities, such as access to a trained health professional at birth and access to education and other public services. These measures of capability poverty map directly onto the key indicators of the health- and education-related MDGs in Annex 1.

Baulch (1996) has usefully described the progressive broadening of what is thought to constitute poverty in terms of a 'pyramid of poverty concepts'. Each concept represents a dimension of well-being, and each conceptualisation constitutes a different combination of dimensions, with the combinations getting broader and more complex (see Figure 1). The traditional 'economic' conception of poverty ideally focuses on line 3 of Baulch's pyramid; i.e. private consumption combined with common property resources and the consumption of state-provided commodities. However, as discussed further below, difficulties of measuring consumption of state-provided commodities and access to common property resources often results in a focus on private consumption alone. At the other end of the spectrum, Sen (1999) sees freedom, autonomy and dignity as central and other concepts are relegated to a secondary level of importance. It should be noted that the more complex the conceptualisation of poverty, the more difficult it is to operationalise. Thus, although Sen's approach is a useful in understanding welfare and the attributes of welfare, it is difficult to quantify or capture.

Figure 1: A pyramid of poverty concepts



Source: Baulch, 1996

Note: PC = private consumption; CPR = common property resources; SPC = state provided commodities

Accompanying the alternative conceptualisations of poverty is a burgeoning array of methodological approaches towards its assessment (McGee and Brock, 2001). These include ethnographic investigations using classical anthropological methods (Scott, 1985; McGee, 1998), participatory poverty assessments (Norton et al., 2001), longitudinal village studies (Jayaraman and Lanjouw, 1998), and conventional household surveys (Grosh and Munoz, 1996; Grosh and Glewwe, 2000). The relative merits of alternative conceptions and methodological approaches largely depend upon the purpose of the poverty analysis.

This paper has as its focus the identification of the poor for the specific purpose of monitoring progress towards the MDGs. As such, it primarily concentrates on the more narrow conceptions of *material* (or economic) poverty or well-being. The bulk of the discussion is therefore concerned with issues involved in determining a scalar indicator of households' material welfare and the strengths and limitations of alternative choices. However, as is discussed below, the search for alternative indicators of material household welfare has resulted in some measures that reflect a broader conception of poverty.



3 Measuring ‘material’ poverty and identifying the poor

The level of material poverty and the profile of the poor found at any one time in any one country are critically dependent upon two criteria: how people are ranked in terms of welfare and the definition of the poverty line. Where the poverty line is set determines how *many* people are poor and how many are non-poor, and may also determine who is entitled to state transfers and other publicly provided benefits. As such, its determination is almost always a matter for debate and controversy, and the derivation of the poverty line commonly receives the bulk of attention and intellectual effort in studies of poverty (Olson Lanjouw, 1997). However, how the population is ‘lined up’ against the poverty line is equally, if not more, important in determining *who* is poor. A change in the definition of the welfare indicator that results in a change in the ranking of the population will result in a different set of people being defined as poor, even if the poverty line remains the same. Yet this aspect often receives less attention from the analyst – despite the fact that the purpose of most poverty analyses is to identify the characteristics of the poor. Theoretical considerations in the choice of poverty line are discussed below, followed by an assessment of alternative approaches to measuring and ranking households’ economic welfare.

3.1 Absolute or relative poverty?

There are two main approaches to constructing a poverty line. An absolute definition of poverty assumes it is possible to define a minimum standard of living based on a person’s physiological needs for water, clothing and shelter; i.e. their basic needs. In contrast, the relative approach defines poverty in relation to a generally accepted standard of living in a specific society at a specific time, and goes beyond basic physiological needs. The two concepts of absolute and relative poverty capture different, but equally important, dimensions of the poverty problem. On the one hand, it is essential to identify how many people, and which people, are living in households that are unable to purchase or consume a fixed minimum amount of goods and services; i.e. who are living in absolute poverty. On the other hand, it is also crucial to identify those with resources that are so limited as to exclude them from achieving a life-style that at least approaches that enjoyed by the rest of society. A commonly used relative poverty line is that of households living below half-average income.

Relative poverty lines make most sense in countries where absolute deprivation is *not* the social norm. In many low income countries, an income corresponding to the half the

median will not necessarily meet even the basic needs of a household. However, even in countries where the majority of the population are living in absolute poverty, relative poverty rates can still provide useful information concerning the characteristics of the poorest of the poor. It is also clear that the relative concept is pertinent to the assessment of social cohesion; something of importance in low and high income countries alike.¹

3.1.1 Absolute poverty lines

Most development agencies are concerned with the reduction of absolute poverty. The definition of poverty inherent within the MDG of eradicating world poverty is an absolute one; i.e. one is considered poor if surviving on less than US\$1 dollar per person a day. This international standard was developed by the World Bank in the 1980s and was based on the average of the poverty lines of ten low income countries, all of which were located wholly or in part within the tropics.

The most common approach to defining an absolute poverty line is to estimate the cost of a basket of goods that contains quantities of commodities sufficient to ensure that basic consumption needs are met. The main problem is in choosing the food energy requirements for 'basic needs'. In addition to setting the calorific requirements, the mixture of food goods used to 'supply' these calories must be appropriate to the country in question. For example, the basket should not contain meat as the main source of protein in a country where the majority of the population are vegetarians (or vice versa, as has been the case in some World Bank-sponsored poverty lines in the former Soviet Union; see Popkin et al. (1996)). The composition of the food basket should ideally be based on country-specific consumption patterns of low income households rather than simply identifying the lowest cost food bundle which achieves the required energy intake. The second problem is in making allowance for non-food consumption. Often this is done by finding the minimum costs of a food basket and then dividing this by the share of food in total expenditure of low income households. This gives a reasonable approximation of total subsistence costs.

The appeal of an absolute definition of poverty is its apparent clarity and its moral force. However, there are some problems with an absolute definition. The main difficulty in defining an adequate minimum is that standards of living themselves change over time and space. The costs of purchasing the minimum basket may vary across regions within a country (and between countries) and over time, as indeed will energy intake and patterns of food consumption. Beveridge (1942) recognised that 'determination of what is required for reasonable human subsistence is to some extent a matter of judgement; estimates on this point change with time and generally in a progressive community, change upwards'. How we clothe and feed ourselves has changed drastically over the years. So has the state of knowledge about nutritional requirements. Furthermore, climatic conditions in different countries generate different needs, and even within countries individuals vary in their physical requirements.

Given these issues, it is questionable whether it is possible (or appropriate) to have a

universal international absolute poverty line – such as the MDG line of US\$1 a day – that is applicable across both time and space. In its report on poverty in Central and Eastern Europe and the former Soviet Union, the World Bank (2000) argues that a higher poverty line is needed in that region, given that its cooler climate necessitates additional expenditures on heat, winter clothing and food. A line of US\$2 a day was therefore taken as a low threshold. A higher threshold of US\$4 was also used, recognising that what may be considered as 'subsistence needs' inevitably varies with the level of a country's development; even the poorest households in the region incur expenses on some basic services such as postal services, childcare and health care, and need to cover the running costs of a minimum of some basic consumer durables, such as a (black and white) television or a refrigerator.

There are also methodological problems in applying an international poverty line. In converting the US dollar poverty lines into national currencies, account is taken of differences in the costs of goods, recognising that US\$1 exchanged into rupees at the market exchange rate in Delhi will buy more loaves of bread than US\$1 exchanged into roubles in Moscow or the same money spent directly in New York. Estimates of these differences in purchasing power use costings based on retail price surveys, and the international poverty lines therefore reflect 'purchasing power parity' (PPP) dollars rather than actual dollars. However, it is difficult to estimate comparable prices when markets are only partially developed, as remains the case in many de-monetised and rural economies. Absolute poverty rates based on the PPP dollar lines should therefore be viewed as providing 'broad-brush' estimates only; estimates which are useful for monitoring progress at the national or supra-national level but which should not be used for targeting purposes.

Although international poverty lines defined in US dollars allow easy comparison of poverty across countries (perhaps too easy in view of the imprecision of the PPP estimates), they tell us very little about the level of resources considered as representing subsistence needs in any particular country. Thus, the US\$1 poverty line should be seen as a supplement to rather than replacement for a national poverty line based on a minimum consumption basket that has been calculated and priced specifically for an individual country's own circumstances. National poverty lines are a vital part of the fight against poverty, helping to maintain poverty as a focus of public attention. An official poverty line provides a public benchmark for the level of living standards that are considered adequate in a country, and thus constitutes a key device for monitoring the progress of poverty reduction policies, whether by government or other parts of civil society. If the number of people that are poor in a country according to an official national poverty line rises from one year to the next, then whatever else may be happening in that country, one key aspect of national well-being has deteriorated.

3.1.2 Relative poverty lines

Relative poverty is where poverty is defined in relation to a generally accepted standard of living in a specific society at a specific time, and goes beyond basic physiological

needs. This view of poverty has a long heritage. In the eighteenth century, Adam Smith commented that 'by necessities I understand not only commodities which are indispensably necessary for the support of life, but whatever the custom of the country renders it indecent for creditable people, even of the lowest order, to be without'. More recently, Peter Townsend argued that 'Individuals ... can be said to be in poverty when they lack the resources to obtain the types of diet, participate in the activities and have the living conditions and amenities which are customary, or at least widely encouraged or approved in the societies to which they belong'.

However, again there are problems in defining a poverty line within this approach. How do we establish what the norms of our society are? What do we put in the basket of goods? At least with the absolute approach there are reasonably objective norms, but with the relative approach the decisions concerning what is an acceptable minimum become much more subjective.

A commonly adopted solution is to use a 'proportional' measure. The definition of poverty used by the European Commission to compare the incidence of poverty across member states is that of half the mean (average) country-specific household expenditure. Thus, households are defined as poor if they have a level of total expenditure below half the national average. This has the advantage of allowing comparisons across countries, whilst using a country-specific measure. The idea of using 50 per cent of the current year average as a 'poverty line' was proposed in the 1960s by US economist Fuchs because it was a line that would automatically rise as living standards rose.

Another approach that is widely used is simply to define the poverty line as a percentage cut-off point in the welfare distribution below which people are poor. Commonly used definitions are the bottom 20 per cent or 40 per cent of the population. This approach to setting the poverty line is attractive in that it is both simple and transparent, and is quite functional in terms of identifying a population sub-group upon which to focus attention.

There are dangers, however, in an entirely relative approach. A definition of poverty that is entirely relative would deny the existence of poverty in a country where everyone was starving. It would also not reflect a dramatic fall in living standards if everyone's living standards fell drastically but evenly, as under a relative approach the number of poor would not change (Sen, 1987). A relative poverty line is not very useful if one wants to monitor poverty over time or space. There will always be a bottom 20 per cent of the population, even if living standards for the whole population have risen over time. Furthermore, as Jean O. Lanjouw (1997) points out, the relative poverty line is essentially arbitrary. It is not clear why poverty should be defined in terms of one percentage point instead of another – and the percentage point settled upon can influence the characteristics of the subgroup designated as poor.

However, as discussed above, the advantage of relative poverty lines is that in countries with high absolute poverty, they serve to focus attention on the poorest of the poor. They

can also provide a useful way of summarising distributional outcomes. Finally, relative poverty lines can be applied to scalar indicators of welfare that are not money metric and for which it is not possible to construct an absolute poverty line. This is particularly pertinent to the discussion of asset-based welfare indicators in Section 4 below.

In deciding which approach to take in determining the poverty line, it is important to bear in mind the context within which the poverty line is to be used. Ultimately it is a policy tool and can only be useful as such.

3.2 Money-metric measures of household welfare: Income or expenditure?

Quantifying the welfare of individuals or households is notoriously difficult. In theory, the best indicator of welfare is the actual consumption of the individuals, and ideally this consumption would include both consumption of food and other goods as well as consumption of services such as education and health. In practice, income and expenditure data are commonly used to proxy for the level of consumption enjoyed. They are normally easier to measure directly and have the advantage of providing a monetary definition of poverty. Such a definition is readily understood by the wider public.

A money-metric measure of welfare can be built up in a variety of ways. However, before discussing the strengths and weaknesses of alternative approaches, it is important to recognise the general limitations of such an indicator. Using a monetary definition does not take into account the terms on which that money is 'received' and, in particular, of the time spent working (Piachaud, 1987). This is a point that has particular relevance for women who often work in low status jobs. On a purely monetary definition, 'earning' US \$10 a week (either in cash or in kind) in a 50-hour week in an unpleasant job is treated in the same way as earning US\$10 in a 20-hour week in a pleasant job, even though the quality of life which results from these two cases is likely to be very different. Furthermore, a money-metric definition tells us nothing about the environment in which people live and work, including time spent travelling to work, to buy (or sell) produce or to collect water. In theory, it might be possible to put a monetary value on some of these aspects of quality of life, although it is hard to imagine that this could be done without a great deal of controversy.

3.2.1 Income or expenditure?

Views differ as to whether income or consumption expenditure provides the better indicator of economic welfare, although as Atkinson (1989) points out, the fundamental distinction as to whether poverty is concerned with low income or low spending is rarely made explicit. However, very different results are obtained depending on which measure is used.

There are two main reasons why an analysis based on income may lead to different conclusions from one based on expenditure. Firstly, a household may have an income (Y) below a given amount (Z) (the poverty line) but may be able to attain a level of

expenditure (E) above Z by running down savings or by borrowing. In such cases $Y < Z < E$. Thus, if income is used as the indicator the household would be defined as poor, but if expenditure was used the same household would be defined as not poor. Conversely, receipt of an income above Z does not imply that a minimum target level of consumption is necessarily realised and it is possible that $Y > Z > E$.

Secondly, income and expenditure may also give different answers because of the constraints faced and choices made by individuals and households. In addition to consumption possibilities, the actual level of expenditure will also reflect tastes. To choose not to eat meat is one thing, but to have no opportunity to do so is something entirely different. Thus, a vegetarian who by choice only spends money on rice and beans, and an elderly person who would prefer to eat meat but who can only afford rice and beans, may both be defined as poor using expenditure, but in fact the vegetarian may be defined as non-poor when using income.

So which should be used? The choice depends partially upon the conception of poverty being employed. Atkinson (1989) distinguishes between a 'standard of living approach' and a 'minimum rights' approach to poverty. Interpreting poverty as a low standard of living leads naturally to a focus on consumption expenditure. The right to a minimum level of resources in order to participate within society leads, on the other hand, to income.

Economists generally prefer expenditure to income as incomes tend to fluctuate over the course of a year, particularly so in developing countries where income is dependent on the agricultural seasons. The permanent income hypothesis, first proposed by Friedman (1957), supports the view that consumption expenditure is a better proxy for permanent income, since people tend to smooth out their fluctuations in income, and this is reflected in their expenditure. For example, if a person receives a bonus, they do not necessarily spend it; they may save part of it. Similarly, if income falls in a particular year, a person may use savings to make up for the temporary short-fall. However, the permanent income hypothesis assumes perfect capital markets – that one can borrow and save, which is often not the case in developing countries – and hence can be an argument for using income. In practice, the choice of welfare indicator is often dictated by more prosaic, but nonetheless important, considerations – most notably ease of data collection and the degree of measurement error.

3.3 Practical issues in measuring household income and expenditure

There are a number of practical and measurement issues in the choice between income and expenditure as a measure of household welfare. These are summarised here and are usefully discussed in greater detail in Hentschel and Lanjouw (1996), Deaton (1997) and Deaton and Zaidi (1999).

3.3.1 Measurement error: Under-reporting and recall bias

The problems of collecting high quality income and expenditure data are legendary. It is widely acknowledged that income data in particular are often subject to problems of under-reporting, especially income derived from the private and informal sectors. This problem is exacerbated if respondents to the survey think that the information they give may be used for purposes other than the survey itself. For example, if people (wrongly) think that the information may be passed to the tax office, then this may cause them to under-estimate their income or refuse to answer the questions altogether.

Expenditure data is subject to a different set of problems. Income, for the majority of people, is a regular flow of money, with pensions and wages usually being paid weekly or monthly.² Expenditure, however, may be irregular. Some people may shop for food every day, whilst others go to the market once a week or even less frequently. Non-food items may be subject to even greater fluctuations. Expenditure data in most developing countries is usually collected on the basis of recall (rather than recorded contemporaneously in a diary) and the recall period is commonly the previous week, two weeks or month. Recall data are prone to large measurement errors, some of which, but not all, are random. Scott and Amenuvegbe (1990) found that the longer the recall period, the lower the consumption reported. A different but related problem is identified by Pradhan (2000), who found that the more commodities listed on the recall sheet, the higher the measure of aggregated consumption that results. Changes in the number of items included in the survey instrument may therefore bias inter-temporal or cross-national comparisons. Moreover, omission of certain categories of expenditures may bias the profile of poverty if the effect of the omitted category is non random.

3.3.2 Valuing home production of foodstuffs

In societies where the majority of people earn a wage or monetary payment and have little resources beyond wages or social security benefits, it may be adequate to define expenditure (or income) in relation to *cash*; i.e. monies actually spent on goods (or monies earned or otherwise received). However, in agricultural/rural economies home production may account for a significant proportion of a household's consumption. The valuation of such production is a major issue for the calculation of both expenditure *and* income for households that are both producers and consumers. One approach is to ask respondents to value their consumption of home production directly. More commonly, however, surveys collect information on the quantity of food-stuffs consumed, and it is necessary to impute a cash value. This then entails a decision over which prices to use: market (what it would have cost to buy it) or farm-gate (the opportunity cost of not selling it), local or regional, state-subsidised or private. Ideally the prices used should reflect differences in labour, transport and production costs (for a fuller discussion of these issues see Deaton and Zaidi (1999)). They should also ideally reflect differences in quality. For example, using market prices to impute the income foregone by consumption of home production may overestimate its value due to differences in the quality of goods consumed versus those 'selected' to be sold in the marketplace.

A similar problem arises in imputing the value of wage or transfer income when people are paid in-kind. This is a particular problem in the countries of the FSU, where partial demonetisation of the economy, the growing informalisation of the labour market, increasing reliance on non-market forms of production and inter-household transfers have resulted in household incomes comprising a complex mix of in-cash, in-kind, official, unofficial and informal payments (Falkingham, 1999). There are real issues in how one attributes a value to child benefit that is paid in kind in vodka, as has been recorded in some regions of Russia.

3.3.3 Deriving the 'use value' of other goods and services

Similar problems arise in deriving the 'use value' of other goods and services. Data requirements for such goods often make them difficult to estimate. For example, the valuation of semi-durable or durable goods requires information on depreciation rates as well as prices. There are particular problems in valuing the imputed benefit of owner-occupied housing in regions where the rental equivalent is almost impossible to determine. This is especially the case in rural areas or in the transition economies of the former Soviet Union, where there is virtually no rental market for housing.

Pricing basic services can also become complex. For example, how do you price expenditure on water, when water may be supplied through public provision in one area, while in another area households may have to purchase water from a private seller, for a higher price.³

Finally, there are issues surrounding the implications for poverty profiles of imputing a value to benefits in kind from services such as publicly provided education and health services. On the one hand it is desirable to include them, as their omission may bias cross-national comparisons (see, for example, work by Gardiner et al. (1995)). But on the other hand, imputing a value to receipt of health care services may move a person within the welfare distribution of a country. For example, other things being equal, a household containing a person who received health care in the past year will have a higher ranking than a household where everyone has been healthy all year. Similarly, high private spending on health may result in a household being defined as non poor. Therefore, it may be desirable to impute a value on health services for cross-national comparisons of welfare but not for within-country comparisons of welfare.

3.4 Equivalence scales and the profile of poverty

Finally, even if we are able to construct a consumption aggregate that adequately includes the consumption of home-produced foodstuffs, other goods and benefits in kind received from public services in order to compare the living standards of different households (i.e. to *rank* them), it is then necessary to adjust their total expenditures for differences between them in their sizes. Larger households have greater needs; for example, there are more mouths to feed. Adjustment may also be made for differences in the composition of the household, recognising that the need for expenditure differs between children, working-age adults and the elderly. The choice of 'equivalence scale',

the term given to the adjustment factor, may have major implications both for the overall level of measured poverty and for which groups in the population are shown to suffer most.

The simplest (and commonest) approach is to ignore differences in composition and to divide total expenditure by the number of persons in the household. This *per capita* adjustment assumes that there are no 'economies of scale' associated with household size. Thus, a household of four persons is assumed to have twice the needs of a household of two.

Economies of scale may arise for various reasons; for example, housing costs such as rent and heating are unlikely to double when household size doubles. The extent of economies of scale is linked to the extent to which there are public goods included in the household's consumption basket. Dreze and Srinivsan (1995) argue that the share of public goods in total consumption can be interpreted as an upper-bound of the degree of economies of scale in household consumption, and that adjusting for economies of scale in consumption is necessary if there are large shifts in the relative prices faced by households of differing sizes or compositions.

A widely accepted way of taking economies of scale into account is to adjust total expenditure as follows:

Adjusted expenditure = Total expenditure / [Household size ^A]

where A is a number between 0 and 1. For example, with A equal to 0.5 (strong economies of scale), a household of four persons is assumed to have needs that are twice those of a one-person household, whereas with the per capita adjustment (A = 1.0, no economies of scale) their needs would be four times as high. Where there are moderate economies of scale, and A is equal to 0.75, it is assumed that a four-person household has needs that are 2.8 times those of the one-person household.

The derivation of equivalence scales involves several factors, including how needs vary with age and activity level and the share of food in total household expenditure. Many equivalence scales take the food share of low income families as a reference (Ravallion, 1992). In many low income countries, where housing costs currently constitute a relatively small share of total expenditures, there are likely to be relatively low economies of scale, implying that the per capita adjustment may be a reasonable one.

The choice of equivalence scale can significantly alter the profile of poverty (Lanjouw and Ravallion, 1995). In particular, work by Lanjouw, Milanovic and Paternostro (1998) found that using a per capita welfare indicator can lead to a conclusion that larger households are poorer, whilst alternative equivalence scales will reverse this conclusion. The somewhat surprising finding in the World Bank report on the profile of poverty in Russia that pensioners are less likely to be poor than other groups is due in part to the

equivalence scale implicit in the poverty line used.

It is important to note that the above discussion assumes that it is possible to identify the household within which resources are pooled and economies of scale. A common criticism of household surveys is the inability of any one 'official' definition of a household to reflect adequately the sheer diversity of living arrangements that exist in most countries (Kandiyoti, 1999). Yet, the definition of the household is central to the measurement of the welfare of the individuals living within it.

Furthermore, if one is interested in the welfare of individuals rather than households *per se*, information is needed on *intra*-household distribution of resources. Most analysts avoid this problem and assume that all household resources are shared equally among their members. However, there is a growing body of literature that shows that in reality this is rarely the case in either developed (Pahl, 1995; Vogler, 1998) or developing countries (Alderman et al., 1995; Bruce and Dwyer, 1988; Evans, 1989; Moore, 1992).



4 Alternative approaches to measuring household welfare

Given the problems in measuring income and expenditure and the difficulties in determining how, if at all, to adjust for differences in household size and composition, analysts are increasingly concerned to identify alternative measures of household welfare that are robust but less data intensive and subject to smaller measurement error.

Alternative indicators of household welfare are also required in situations not only where income and expenditure data are of poor quality, but also where they are completely absent. This is particularly relevant for analysts interested in monitoring the distributional dimension of progress towards the non-economic-related MDGs. In many cases the surveys that contain detailed information on, for example, health-related outcomes such as infant and child mortality or access to reproductive health services, do not collect information on household incomes or expenditures. The DHS are a notable example, and as such, attempts to derive proxy indicators of consumption using DHS data warrant particular attention.

Finally, the search for alternative approaches has for some analysts been motivated by theoretical rather than practical considerations; in particular the growing belief that money-metric expenditures define the poor in too narrow a manner (Sahn and Stifel, 2001).

4.1 Asset indicators in the Demographic and Health Surveys

DHS have now been administered in approximately 50 countries across Africa, Asia, the Arab world, Latin America and the former Soviet Union. The primary focus of the surveys is to collect information regarding demographic- and health-related behaviours. The survey instruments do not include any questions on income and expenditure. However, they do include a range of questions on the *ownership of assets* such as a car, refrigerator or television, as well as *dwelling characteristics* such as type of roof and flooring materials and type of toilet, and *access to basic services*, including clean water and electricity. As the interest in poverty amongst the international donor community has increased, so too have the number of studies that use these questions to construct indicators of households' socio-economic status – despite the fact that this was not the primary purpose for their inclusion in the survey.

Montgomery et al. (2000) provide a useful survey of studies that have used alternative measures of household socio-economic status to examine demographic behaviour and outcomes. Since their survey, important methodological contributions have been made by, amongst others, Filmer and Pritchett (1998, 1999) and Sahn and Stifel (2000, 2001). An inventory of selected demographic studies that have used asset-based indicators as a proxy for economic welfare is presented in Annex 2.

4.1.1 Components of the asset index

Most studies have employed a range of indicators, detailed in Box 2.

Box 2: Housing characteristics and household durables in the Demographic and Health Surveys

- Has electricity
- Source of drinking water:
 - pipel water
 - well water
 - surface water
 - rainwater
 - tanker truck
 - bottled water
 - other
- Time to water source
- Type of toilet facility:
 - flush toilet
 - pit toilet latrine
 - no facility
 - other
- Main floor material:
 - natural
 - rudimentary
 - finished
 - other
- Persons per sleeping room
- Household possessions:
 - radio
 - television
 - telephone
 - refrigerator
 - bicycle
 - motorcycle
 - private car

It should be noted that asset ownership based on information from the DHS does not reflect the *quantity* nor *quality* of durable goods owned by the household, and it could be argued that those better off may have superior quality or more technologically advanced equipment than those less well off. For example, they may have a colour television rather than black and white or be able to receive satellite and digital transmissions rather than terrestrial. In most countries, using simple information on ownership of durables, taken in conjunction with information on basic services and dwelling information, is unlikely to affect the final picture of welfare. However, in some circumstances, such as the transition countries of Central Asia, where most households own durables such as televisions and refrigerators, it would be useful to distinguish whether these durables were obtained during or post the Soviet administration. Furthermore, the DHS, unlike the Core Welfare Indicator Questionnaire (CWIQ),⁴ does not distinguish whether the durables are in working condition. Similarly, there is no information on the reliability of the supply services such as electricity or water. Households in many low income countries suffer from frequent power cuts and interruptions to other services.

There are also methodological issues in including in a *household*-based indicator assets and services that are shared or publicly owned, such as well water or pit latrine or connection to electricity supply (Deaton, 1997).

Finally, there are problems in generalising indicators across rural and urban areas. The index treats ownership of assets and housing characteristics as equivalent in both rural and urban areas, even though they may have very different meanings. For example, urban slum dwellers often live in brick and concrete houses but in far worse conditions than rural families in thatched or tin houses (for a detailed discussion of this issue see Kausar, Griffiths and Matthews (1999)).

4.1.2 A question of weighting

In order to create an index from the information on asset ownership it is necessary to aggregate the individual responses. A number of different techniques have been used in the literature.

The simplest approach is to assign equal weights to the ownership of each asset or presence of each household dwelling characteristic. For example, Jensen (1996) in his analysis of fertility in Indonesia using the 1991 DHS, employed an additive index of durables owned and housing quality variables. Similarly, Guilkey and Jayne (1997), in their study of contraceptive use in Zimbabwe, summed ownership of a number of consumer durables and indicator variables for access to land, clean drinking water and good sanitation facilities. However, such an approach assumes that the welfare value of the ownership of a radio is the same as having access to a flush toilet, which in turn is the same as having safe drinking water. Clearly this is not the case. Unfortunately, despite this obvious methodological weakness, many of the demographic studies surveyed by Montgomery et al. (2000) in their review article impose equal weights to aggregate the separate indicators into a scalar index.

In an attempt to move away from purely arbitrary weights, in the construction of the Index of Fulfilment of Basic Needs – the Bolivian national poverty benchmark comprising of ten indicators capturing housing quality, access to public services, education and access to informal and formal health services – the indicators were combined using weights determined by a form of consultative process among national poverty experts and policy analysts (Navajas et al., 2000). Although this approach is an improvement on the first solution, it still involves subjective decisions regarding the welfare value of each component.

A third, and more objective, approach is to impose a set of weights using the prices of various assets. Dargent-Molina et al. (1994) use a measure that sums the values of all goods owned by the household. However, this is only possible if the prices of various assets are available, and involves similar problems in the estimation of the value of basic services and dwelling attributes to those discussed in Section 3.3.3. Furthermore, Bollen, Glanville and Stecklov (2002) found that a proxy measure based on the value of household goods performed substantially *worse* than one based on ownership. They argued that many respondents are unable to value their goods realistically and responses are likely to contain a large amount of error. This is further compounded in situations with significant regional price variation and high inflation.

A fourth approach is not to construct an index but to enter all the components of the asset indicator in a multivariate regression equation. This procedure is employed by Sandiford et al. (1995) in their study of child health, and is recommended as the preferred approach in Montgomery et al. (2000). This method deals with the problem of ‘controlling’ for wealth in estimating the impact of non-wealth variables. It does not, however, identify the wealth effect, as many assets can have both a direct and indirect effect on outcomes. For example, a household’s access to piped water may indicate greater wealth but may also impact upon health independently. One cannot infer the impact of an increase in wealth on the health outcomes from the unconstrained coefficients on the asset variables in the regression model. Thus, while the regression coefficients produce a liner ‘index’ of the asset variable that best predict the dependent variable (e.g. health), this ‘index’ cannot be interpreted as the effect of an increase in wealth on health.

An alternative approach is to use a statistical procedure to determine the weights of the asset index. Filmer and Pritchett (1998) used the principal components technique to determine the weights, whilst Sahn and Stifel (2000) favoured the use of factor analysis (see Annex 3 for a description of these statistical techniques). Interestingly, there is little difference in the two alternative approaches: the Spearman rank coefficient for indices created using the two methods was found by Shan and Stifel (2000) to be about 0.98. Most recent studies have therefore used the simpler principal components method (for example, Zeller, et al. (2001)).⁵

4.1.3 How well do the asset indices used act as proxies for welfare?

One criticism levied against the use of asset indices is that the components of the index are often taken from a generic list, despite the fact that qualitative studies emphasise the need to tailor measures to reflect living conditions of the country, region or area under analysis (Moser and Holland 1997; Moser 1998; Bond and Mukherjee 2001). Usually, the choice of asset indicators is limited to those available in the survey and as such there remain many unanswered questions as to their appropriateness.

Few studies have attempted to verify the extent to which the asset indicator being used is a good proxy for household consumption; the main reason being that such verification requires a data set that contains both the components of the asset index and the money-metric measure of household consumption they are meant to represent.

Montgomery et al. (2000) evaluated the performance of proxy measures commonly used in demographic studies employing data from the DHS in relation to consumption expenditure per adult, the latter being their preferred measure of living standards. To do this they used data from LSMS surveys from five countries⁶ and a consumption survey from rural Guatemala. The LSMS data include questions on asset ownership and dwelling characteristics, allowing them to replicate the proxy indicators directly and then to correlate the resultant index with a measure of consumption. They found that the proxy variables were weak predictors of consumption per adult, with extremely low partial R^2 values. However, in subsequent analyses of fertility, child schooling and mortality, the proxy-based coefficient estimates compared favourably to those obtained using consumption, providing a generally reliable guide to the sign and magnitude of the preferred estimates. Sahn and Stifel (2001), using data from 12 separate LSMS,⁷ also found the correlation of their asset index with household expenditure to be weak. They defend this by arguing that the asset index was not intended to be a proxy for consumption but rather an alternative indicator of households' wealth.

In contrast, Filmer and Pritchett (1998), who validated their asset index using data from the Indonesian, Pakistani and Nepalese LSMS, concluded that the asset index had 'reasonable coherence' with current consumption expenditures and worked 'as well or better, than traditional expenditure-based measures in predicting [educational] enrolment status'. They also note that their asset index is better thought of as acting as a proxy for long-run household wealth rather than current per capita consumption.

Finally, in a paper as part of the MEASURE evaluation project, Bollen et al. (2002) examined the performance of several alternative proxies for economic status. They do not assume that money-metric measures are the gold standard, but rather focus on how the choice of proxy for economic status influences the predicted effects of other explanatory variables on fertility. They conclude that if the researchers' focus is on economic status itself (as is the case when using proxies to identify the poor), then the choice of proxy can make a difference. If, however, attention lies on other variables and economic status is being used as a control, then the non-economic status variables are relatively robust to the choice of proxy.

It would be interesting to carry out further analysis to investigate the extent to which the *rankings* of households are robust to the choice and method of proxy indicator. It is would also be interesting to explore whether the correlation between proxy indicators and money-metric measures of welfare changes when alternative assumptions regarding equivalence scales are made since, as we have already discussed, a household's money-metric ranking may vary depending upon the choices made.

4.1.4 Summary

- It appears that there is significant mileage in using statistically weighted, asset-based indices to produce welfare *rankings* of the population.
- However, it is important to recognise that such indices are generally poor proxies for current consumption/income and may be better thought of as being proxies for longer term or 'permanent' income.
- Furthermore, their use is strictly limited to providing *relative* analyses of welfare; for example, the characteristics of those households in the bottom 20 per cent of the distribution versus those in the top 20 per cent of the distribution.
- Asset indices can say nothing about levels of absolute poverty.
- Asset indices cannot be used reliably to monitor *changes* in poverty over time, as there may be significant changes in household ownership of, or access to, some of the index components, which may not necessarily translate into a reduction in material poverty.
- Further work is needed to validate existing asset-based indices and to develop alternatives.

4.2 Other experiences with proxy indicators of welfare

4.2.1 Lessons from the field

Most programmatic interventions in the development field are now committed to deepening their poverty focus; i.e. increasing poverty outreach and their impact on poor people. In order to evaluate this dimension of their performance, programmes need information on the levels of poverty amongst their clients relative to people within the same community. Two approaches have been commonly used by microfinance institutions (MFIs): Participatory Wealth Ranking (PWR) and the CASHPOR⁸ House Index (CHI) (Simanowitz, Nkuna and Kasim, 2000).⁹

The CASHPOR House Index

CHI was first used to target services to poor clients by the Grameen Bank in Bangladesh. It uses external housing conditions as a proxy for welfare. The advantage is that the index is easy to calculate and is based on simple, observable and verifiable information similar to that collected in the DHS.

Table 1: Components of the CASHPOR House Index and adaptations to South India and China

CASHPOR House Index		Adaptation to South India		Adaptation to China	
Size of house		Size of house		Size of house	
<i>Category</i>	<i>Point</i>	<i>Category</i>	<i>Point</i>	<i>Category</i>	<i>Point</i>
Small	0	Small < 20 sq. meters	0	Small	0
Medium	2	Medium 20–29 sq. meters	2	Medium	2
Large	6	Large > 29 sq. meters	6	Large	6
Structural condition		Structural condition		Structural condition	
<i>Category</i>	<i>Point</i>	<i>Category</i>	<i>Point</i>	<i>Category</i>	<i>Point</i>
Dilapidated	0	Dilapidated	0	Dilapidated	0
Average	2	Average	2	Average	2
Good	6	Good	6	Good	6
Quality of walls		Height and materials of walls		Quality of walls	
<i>Category</i>	<i>Point</i>	<i>Category</i>	<i>Point</i>	<i>Category</i>	<i>Point</i>
Poor	0	< 4 feet mud	0	Poor	0
Average	2	4 feet mud	2	Average	2
Good	6	> 5 feet	6	Good	6
Quality of roof		Quality of roof		Quality of roof	
<i>Category</i>	<i>Point</i>	<i>Category</i>	<i>Point</i>	<i>Category</i>	<i>Point</i>
Thatch/leaves	0	Thatch/leaves	0	Non/mud	0
Tin/iron sheets	2	Tin/iron sheets	2	Partial stone	2
Permanent roof	6	Tiles and other good materials	6	Cement/concrete	6

Source: Simanowitz, Nkuna and Kasim (2000)

The general guide to determining the poverty status of households is:

Score 3 or less	Very poor
Score 4–6	Poor
Score 7 or more	Not poor

Where households score 4 or more they are excluded from being eligible for the programme. As such, there is an appeals process whereby households can ask for their eligibility to be reassessed through interview. It is argued that this approach to identifying the poor, and hence eligible clients for a poverty reduction programme, can be highly effective¹⁰ and low cost. However, this is only the case where household characteristics have a strong relationship to poverty. For example, where the poor have benefited from public housing programmes, as in some Scheduled Caste villages in southern India, the housing index is not an appropriate tool to distinguish between the poor and non poor.

There has been little systematic evaluation of the targeting efficiency of CHI. Two studies have compared the poverty rankings obtained as a result of using CHI and a PWR exercise and found a poor correlation (Simanowitz, 2000). There were many cases where people were judged to be living in poverty even though they had reasonable housing conditions. For example, there were people living in houses constructed prior to the death of the main breadwinner. Given this, and the arbitrary nature of the weighting used, we would urge caution before extending its use beyond the area of MFI.

Participatory Wealth Ranking

PWR offers a method for communities themselves to define who the poor are, providing a more holistic and people-centred determination of poverty and its ranking (Bilsborrow, 1994). An important function of the methodology is the empowerment of the community, asserting the primacy of local knowledge over externally determined measurement criteria. The ranking is based on the subjective views of the people in a community, who generate their own criteria with which to rank poverty or wealth.

The ranking takes place in three steps: mapping, reference groups and analysis (Grandin, 1998).

Mapping A community meeting is set up involving representatives from all areas of the village. A village map is then drawn and a list of households generated from the map. Each household is then given a card.

Reference groups Three reference groups are set up for each section of the village that has been mapped, with three to five members of the community in each group. Each group then meets separately and sorts the household cards into piles according to wealth on a continuum from high to low.

Analysis The results of the ranking of the different reference groups are brought together and the piles are scored. The final score of each household is the average of the ranks it was given by the three reference groups.

The attraction of PWR is that it is conceptually simple, the results are transparent and, given the involvement of the community in their derivation, the rankings are widely accepted. However, it requires skilled facilitators and deliberate distortion of results by participants can make the results unusable – although this is relatively rare. The main drawback from the perspective of monitoring progress towards the MDGs is that while this approach has been found to work well in identifying the poor at the village or neighbourhood level, it cannot be used to rank larger populations or determine the poorest in a large geographic region. It also tells us nothing about levels of absolute poverty. Nevertheless, it offers a promising way forward for monitoring the poverty focus of interventions at the local level.

4.2.2 Lessons from proxy means testing

Valuable insights into alternative appropriate components for inclusion in asset-based welfare indices are offered by research carried out by economists and social policy analysts interested in identifying welfare proxies for the purposes of targeting welfare benefits (Grosh and Baker, 1995; Alexandrova and Braithwaite, 1997; Grosh and Glinskaya, 1998; Ahmed and Bouis, 2001). The steps involved in designing a proxy means test are detailed in Annex 4. A notable characteristic of all these studies is that they start by constructing a consumption aggregate (usually from a LSMS) and then identify a set of variables that correlate with this measure of household welfare. Interestingly, most proxy means tests include direct summary questions on total household income and expenditure or sources of income.

Grosh and Glinskaya (1998) identify six classes of independent variables that are predicted to correlate with poverty:

- location
- household composition
- social categories (such as student or pensioner status)
- housing quality
- ownership of assets and consumer durables
- employment and verifiable income-related variables.

In their work on developing a proxy means test for Armenia, Grosh and Glinskaya (1998) found that overall the regression equations were relatively poor predictors of the variation in per capita expenditure (their preferred consumption aggregate), with the best equation producing an R squared of just 0.31. However, they also note that this may be a function of the particular circumstances of transition countries. In a full market setting, the assets which constitute the core of the proxies equation (human capital, housing, land, livestock etc.) are correlated with consumption, both because past earnings were necessary to acquire the assets and because the assets can generate a return in the present. However, since markets are not fully developed in Armenia, the authors argue that it is not surprising that the correlation between assets and current expenditure is low. This reaffirms the point made earlier that greater detail on both the type of asset and the timing of acquiring that asset may be required in transition countries than in other low income countries.

Ahmed and Bouis (2001), in their work on developing a proxy means test for targeting food subsidies in Egypt, found that the predictive performance of their model was relatively high. The regression model itself had an adjusted R squared of 0.43. However, when households were ranked by actual per capita expenditures and by predicted expenditures from the estimated model, it was found that nearly three-quarters of those defined as poor using actual expenditure were also predicted as being poor by the model, giving an error of exclusion of 28 per cent. On the other hand, 16 per cent of the actual non-poor were predicted as poor, representing the error of inclusion. Such

targeting errors are within the bounds of tolerance of most programmes.

4.2.3 Lessons from poverty mapping: Combining survey and census data

Recent research on poverty mapping can also provide useful guidance on the development of proxy indicators. Poverty maps provide information on the spatial distribution of living standards and can provide an important policy tool for prioritising the distribution of government expenditures.¹¹ A major impediment to the development of detailed poverty maps is that data on economic welfare, such as income or expenditure, are usually only available in sample surveys, whose limited sample size usually precludes disaggregation below the regional level. In contrast, census data, which have the required spatial coverage, generally lack the necessary detailed data. Thus, most poverty maps rely on welfare indices that aggregate information from the census, such as access to public services and level of education. These indices are commonly labelled 'basic needs indicators' (BNI).

In common with the experience with DHS-based indices, most BNI have been constructed in a fairly ad hoc manner. In many cases, the BNI are restricted to a subset of information from the census and focus almost exclusively on access to services and dwelling characteristics, making little use of other demographic and socio-economic information. Once again, there has been little attempt to validate the extent to which they provide reasonable proxies for household welfare due to data constraints. A notable exception is the work by Hentschel et al. (2000) for Ecuador, detailed in Box 3.

In an attempt to improve the quality of the poverty map in Ecuador, Hentschel et al. (2000) estimated a model of consumption using data from the LSMS, including as explanatory variables those that are also available in the census. These included:

- demographic variables, such as the household's size and its age and sex composition
- the education and occupation of each family member
- the quality of housing (materials, size)
- access to public services, such as electricity and water
- principal language spoken in the household
- location of the household.

This represented a significant expansion on the restricted number of variables in the basic needs indicator detailed in Box 3.

Separate models were estimated for each region, distinguishing between urban and rural areas. The R squared values ranged from 0.46 for rural Sierra to 0.74 for rural Oriente. The parameter estimates from the models were then applied to census data to predict the probability of a given household being poor and to develop a new poverty map for Ecuador.

Box 3: Case study: Evaluating the basic needs indicator in Ecuador

In 1994 the National Statistical Institute of Ecuador developed a basic needs indicator at the household level. It consists of a weighted composite of five variables capturing access to water, sanitation services, waste disposal, education (of household head), and a crowding index (the number of people per bedroom). Each service was allocated a certain number of points according to its availability and type or level. For each household the indicator was the sum of points across the services.

Level	Water	Sanitation	Waste	Education	Crowding
1	100	100	100	100	100
2	50	50	50	50	75
3	25	25	25	25	50
4	0	0	0	0	25
5	na	na	na	na	0

Water: Level 1 = public network; 2 = water truck; 3 = well; 4 = other.

Sanitation: Level 1 = in house, flush; 2 = in house, no flush; 3 = shared; 4 = other.

Waste: Level 1 = collection by trucks; 2 = burned or buried; 3 = discarded; 4 = other.

Education: Level 1 = household head has tertiary education; 2 = secondary; 3 = primary or literate; 4 = none or unknown.

Crowding: Level 1 = one person or fewer to a bedroom; 2 = between one and two; 3 = between two and three; 4 = between three and four; 5 = more than four.

Data from the LSMS for Ecuador can be used to examine how effectively the basic needs indicator performs vis-à-vis poverty measured by consumption expenditure. Only 41 per cent of those households identified by the basic needs criterion as constituting the poorest quintile are in fact among the bottom fifth according to consumption expenditure. Furthermore, almost one in ten households ranked in the bottom quintile by the BNI were ranked in the top two consumption-based quintiles. Thus, leakage from an allocation based on the basic needs criterion would be very high.

Source: Hentschel et al. (2000)

The study usefully demonstrates how sample survey data can be combined with census data to yield reasonably reliable estimates of poverty, even at fairly disaggregated levels. However, as the authors note, beyond a certain level of spatial disaggregation, the standard errors rise rapidly and caution needs to be applied. One practical application of this methodology would be to use the poverty maps in combination with other data on regional patterns. For example, the poverty map could be overlaid with a map documenting the location of primary health care facilities. This kind of exercise could help policymakers decide where to prioritise efforts to expand access to primary health care.

The study also serves to highlight the role that demographic and labour market characteristics can play in improving the predictive power of proxy indicators.

Rather than evaluating a census-based BNI *after* the fact, pioneering work by the Tanzanian National Bureau of Statistics in collaboration with Oxford Policy Management Limited (OPML, 2001) has recently used data from the 2000/01 Household Budget Survey for Tanzania to identify the most important variables for predicting expenditure and poverty status.¹² It is intended that information from these predictors will be incorporated in the population census in 2002, and so maximize the census's usefulness for poverty mapping.

Of the 19 variables included in the first estimation, only eight were significant, with an R squared of 0.35:

- household size
- household dependency ratio
- number of rooms in dwelling occupied by household
- distance to drinking water
- educational status of household head (above standard 4 or not)
- type of settlement (capital city/other urban/rural)
- type of roof material
- distance to nearest health clinic.

The model was then expanded to include information on a wide range of assets such as ownership of hand milling machine, hoes, wheelbarrow, video player, books (not school books), iron, watch and music system. The addition of supplementary information on a total of 19 assets appreciably increased the amount of variance explained by the model, increasing the R squared to 0.45.

Prima facie, the modelling demonstrated a good case for collecting further information on asset ownership in the new census. However, as the authors highlight, the costs of collecting additional data also need be taken into account. Given that it was not practical in the Tanzanian context to include questions on so many assets in the census, it was necessary to prioritise them by selecting a subset that were thought to reflect key aspects of poverty within the specific context of Tanzania *and* which increased the variance explained by the model. The final set of additional questions recommended to the census team included ownership of a telephone, radio, bicycle, hoe, wheelbarrow and an iron (electric or charcoal).

As a next step it would be interesting to take the final set of indicators identified by the OPML work to be included in the 2002 census and convert these into a welfare indicator, using an appropriate statistical methodology to estimate the weights, and then compare the relative welfare rankings based on:

- actual expenditure
- predicted expenditure
- on the scores on the asset indicator.

This would allow a direct evaluation of the two main approaches to using proxy indicators.

4.2.4 Lessons from the Consultative Group to Assist the Poorest Poverty Assessment Tool

A promising new methodology for a simple low-cost tool for identifying the poor is offered by the Consultative Group to Assist the Poorest (CGAP) Poverty Assessment Tool, which has recently been developed by the CGAP of the World Bank in collaboration with the International Food Policy Research Institute (IFPRI). Its development is detailed in Zeller et al. (2001).

The first step in the development of the CGAP tool was to identify a large number of indicators that 'powerfully reflect poverty and for which credible information can be quickly and inexpensively obtained' (Zeller et al., 2001: 11). The initial compilation of indicators was based on a detailed review of results of large, in-depth surveys on household economics as well as of indicators and methods used by micro finance institutions (MFIs), famine early warning systems and national monitoring systems for food security, nutrition and vulnerability (see, for example, Wratten (1995)). This yielded a total of over 300 indicators.

The indicators were then divided into two groups. The first group reflects the *means* to achieve welfare (i.e. the income potential of the household) and includes indicators of the household's human capital (family size, education, occupation), physical capital (type and value of assets owned) and social capital. The second group includes indicators related to achievements in consumption in order to fulfil present and future basic needs (access to health services, food, electricity, energy, water, shelter and clothing, human security and environmental quality). From this it is clear that the CGAP tool is capturing a wider concept of poverty than simple material or economic poverty and is more akin to a measure of capability poverty.

The final selection of the variables to be field tested in a questionnaire was then based on a number of criteria, including the ease and accuracy with which the information could be collected.

Table 2: Indicators in the final CGAP questionnaire

Human resources	Dwelling	Food security and vulnerability	Assets
<ul style="list-style-type: none"> ■ Age and sex of adult household members ■ Level of education of adult household members ■ Occupation of adult household members ■ Number of children below 15 years of age in household ■ Annual clothing/footwear expenditure for all household members 	<ul style="list-style-type: none"> ■ Number of rooms ■ Type of roofing ■ Type of exterior walls ■ Observed structural condition of dwelling ■ Type of electrical connection ■ Type of cooking fuel used ■ Source of drinking water ■ Type of latrine 	<ul style="list-style-type: none"> ■ Number of meals served in last two days ■ Serving frequency (weekly) of three luxury foods ■ Serving frequency (weekly) of one inferior food ■ Hunger episodes in last month ■ Hunger episodes in last 12 months ■ Frequency of purchase of staple goods ■ Size of stock of local staple in dwelling 	<ul style="list-style-type: none"> ■ Area and value of land owned ■ Number and value of selected livestock resources ■ Value of transportation-related assets ■ Value of electric appliances <p><i>Plus</i> Rural/urban indicator</p>

Source: Zeller et al. (2001).

A number of indicators were rejected.

- **Indicators using child-specific information.** Not all households have children, hence using child-related information precluded some households from comparative analysis.
- **Indicators of social capital.** This is an evolving area of investigation, and measurable and comparable indicators were not easily found.
- **Subjective responses.** Responses on self-assessment of poverty were considered unreliable for comparisons.
- **Health-related information.** Eliciting health-related information requires longer recall periods and more intensive and specialised training of interviewers. In the absence of training provided by health specialists (which is expensive), responses can be highly subjective and misleading.

The questions were field tested in four sites, one each in Central America, East Africa, Southern Africa and South Asia, and the final questionnaire is presented in Annex 5. The

tool is still at the development stage and requires additional testing and validation, but it appears to offer an exciting addition to the poverty monitoring toolkit. In particular, the food security and vulnerability indicators turned out to be particularly important in explaining differences in relative poverty in all four case studies.

4.2.5 Lessons from the development of the Core Welfare Monitoring Survey

Another survey tool that has recently attracted significant interest is the World Bank's Core Welfare Monitoring Survey (CWMS). The CWMS is a household survey that measures changes in key social indicators for different population groups, in particular indicators of access, utilisation and satisfaction with core social and economic services. The survey was designed for improving project and sector programme design and the targeting of services towards the poor and most disadvantaged communities.

The combining of the CWMS with a household budget survey is a new experiment. It is intended that the CWMS will serve as a source of rapid information on key social indicators and on service delivery indicators, whilst the larger follow-up survey will provide the money-metric measures needed to signal whether the numbers in poverty are increasing or decreasing. Because the two surveys are carried out on the same sample of households, it will be possible at the end to combine the results of the two surveys so as to cross-tabulate the CWMS indicators by expenditure quintile. The questionnaire differs from the standard household surveys in that it has been designed to assist national statistical offices in producing reliable results more quickly, for monitoring national programmes. These features include: a large sample of households; a simple questionnaire with multiple-choice questions; the use of optical scanners to speed data entry; pre-programmed validation procedures to ensure high built-in data quality levels; and 'push-button' standardised outputs.



5 The way forward

The motivation for this paper is to inform discussions between DFID and other donors on possible ways forward to improve the poverty focus of monitoring progress towards the health-related MDGs and other global initiatives, including the Global Fund. Whilst recognising that poverty is a multi-dimensional concept, most international analyses of poverty focus on a money-metric definition. Indeed, the poverty-related MDG takes as its benchmark a poverty line of US\$1 a day. The key difficulty in measuring the effectiveness of health interventions in improving the health of the poor is that such analysis requires high quality information on both poverty and health status in the same dataset. Although some important contributions have been made in terms of examining the *distribution* of health outcomes across the population (for example, the work by Davidson Gwatkin, Adam Wagstaff and colleagues at the World Bank), serious limitations remain in examining the health of those living on under US\$1 a day, or any alternative absolute poverty line. One obvious option is to adapt existing tools such as the DHS and LSMS. This would involve improving the health module of the LSMS or the socio-economic status module in the DHS (or both).

5.1 Improving information on health outcomes in the Living Standards Measurement Study

The LSMS collect a wide variety of information on a range of socio-economic variables. As one of their primary aims is the measurement of living standards, there are detailed modules on consumption expenditures and income. In-depth information is also collected on economic activity. They usually include only a few additional questions on health, although a number of LSMS do include a special module administered to women of reproductive age, which includes questions on children ever born and children surviving (from which infant mortality can be calculated), contraceptive KAP, and utilisation of reproductive health services (Falkingham, forthcoming).

Diamond et al. (2001) have discussed the types of information necessary for the reliable measurement of health outcomes at length. Given the already complex nature of the LSMS instrument, it may not be practical to include all the health-related questions necessary for comprehensive monitoring of progress towards the health-related MDGs. However, this should not preclude the inclusion of some key variables that would allow valuable insights into the health of the poor. It is suggested that future LSMS should at a minimum include questions on self-reported health status (chronic, acute and mental health), utilisation of health services (both primary and tertiary) and, for women of reproductive age, birth history, KAP and use of health services during last pregnancy. Given the importance of private health expenditures in the impoverishment of households, it is suggested that information on both formal and other out-of-pocket payments related to health care should also be collected. There is already work

underway within the World Bank to improve the identification and measurement of informal payments for health care. To date, this has primarily focused on the transition countries of Central and Eastern Europe and the former Soviet Union (Lewis, 2000). However, given the growing importance of issues such as affordability and sustainability within the health sector, it is vital that this work be extended to other contexts.

5.2 Improving welfare indicators in the demographic and health surveys

Diamond et al. (2001) argue persuasively that ‘DHS information should be seen as the starting point for measuring the health of the poor’. Over the last five years there has been significant progress on the identification and use of proxy indicators of household welfare within the DHS, especially the pioneering work by Pritchett and Filmer. However, this review suggests that continuing to focus on the current, fairly narrow range of asset questions included in the DHS is not sufficient and highlights the need for further work on the identification of a set of suitable asset indicators.

Hentschel et al. (2000) found that demographic characteristics of household members, their level of education and simple information on economic activity status were highly significant correlates of per capita household expenditure. Their focus on the demographic and socio-economic characteristics of *all* members of the household rather than the household head alone, as is common in other studies, is very interesting and has the added benefit of overcoming the problem of missing data for household heads encountered in contexts where polygamy is widely practiced. The inclusion of such variables greatly improved the explanatory power of their model.

Similarly, the work by OPML demonstrated that proxy indicators can be significantly improved by the addition of a few, well selected, supplementary variables. The exciting work by IFPRI and CGAP (Zeller et al., 2001) highlights the importance of food security and vulnerability. Questions that capture these dimensions are relatively simple to ask, and have found to be powerful correlates of money-metric poverty (Falkingham, 2000).

The DHS currently collects information on the demographic characteristics of all household members. It also collects limited information on education and employment status. However, these data have not been used in the construction of aggregate indices of household welfare. Further work is therefore necessary on two fronts:

- to explore whether it is possible to improve proxy indicators using existing DHS data
- to carry out further work on the identification of a small number of easily administered questions that could be included in future DHS.

Questions to be explored should include alternative asset questions as well as indicators of food security and summary money-metric measures.

There is also an urgent need to evaluate the potential possibilities offered by the CGAP and CWIQ instruments.

Further analysis of existing data may also shed light on the robustness of the *rankings* of households to the choice and method of proxy indicator. Many commentators have argued that living standards as measured by money-metric indicators is the central measure or 'gold standard'. However, as this paper highlights, the profile of poverty is sensitive to the choices made concerning the welfare standard and its calculation, in particular the assumptions made regarding economies of scale within the household. This raises the question that, if the profile of the poor as measured by a money-metric indicators changes, what are the implications for other proxies?

Finally, the paper has focused on household welfare; indeed most of the proxies currently used are measured at the household level. However, it is possible for poor individuals to live in rich households and vice versa. Thus, further work focusing on developing suitable welfare rankings for individuals rather than households is also necessary.

5.3 Better tools

A common criticism levied at the quantitative measurement of poverty based on household survey data is that household surveys by their very nature miss out an important group of poor people: the homeless and those in institutions such as orphanages, old peoples' homes and mental hospitals. It is also argued that household surveys will tend to under-represent other poor population groups such as slum dwellers and internally displaced people living in quasi-permanent refugee camps. Work is in progress to improve the sample design of surveys; for example, the 1998/99 Indian National Family Health Survey (INFHS) explicitly targeted slum pockets in their design by including three major cities with known slum populations. However, more work is needed on ways to improve the DHS's (and that of other surveys) coverage of the poor. This will involve improved mapping within countries to ensure that sampling frames capture new areas of settlement as well as additional surveys for particular target groups such as street children or nomadic groups.

Notes

1. For more discussion of relative versus absolute poverty line see Atkinson (1989), Atkinson and Micklewright (1992), Ravallion (1992) and Glewwe and Gaag (1988).
2. It is recognised that in many countries of the FSU wages are currently often paid in arrears and that in practice the 'flow' is very lumpy.
3. These issues are tackled in Hentschel and Lanjouw (1996).
4. The CWIQ, a household survey instrument whose development is currently being funded by the World Bank, is discussed further in Section 4.2.5.
5. It should be noted, however, that several analysts have now suggested that the technique of principal components is statistically inappropriate for deriving weights for categorical data and that the appropriate technique for such data is latent class analysis (see Annex 3).
6. Ghana (1987–89), Jamaica (1989), Pakistan (1991), Peru (1994) and Tanzania (1993–94).
7. Cote d'Ivoire (1988), Ghana (1988, 1992), Jamaica (1998), Madagascar (1993), Nepal (1996), Pakistan (1991), Papua New Guinea (1996), Peru (1994), South Africa (1994) and Vietnam (1993, 1998).
8. CASHPOR is a network of 23 Grameen Bank replications in nine countries of Asia.
9. See www.cgap.org for a number of discussion papers on assessing the relative poverty of microfinance clients.
10. It is estimated by David Gibbons (founder of CASHPOR) that the CHI is about 80 per cent accurate in areas where there is no effective government housing programme.
11. For example, see World Bank (1996) for Ecuador, Government of El Salvador (1995) for El Salvador and FONCODES (1995) for Peru.
12. A similar exercise is currently being carried out by the Tanzanian Ministry of Health in collaboration with Oxford Policy Management and funded by DFID (Antoninis 2001a; 2001b).



References

Ahmed, A. and Bouis, H. (2001) 'Identifying the needy: Proxy means tests for targeting food subsidies in Egypt', Washington DC: IFPRI.

Agarwal, B. (1991) 'Social security and the family: Coping with seasonality and calamity in rural India', in A. Ethisham, J. Dreze, J. Hills and A. Sen (eds) *Social Security in Developing Countries*, Oxford: Oxford University Press.

Alderman, H., Chiappori, P., Haddad, L., Hoddinott, J. and Kanbur, R. (1995) 'Unitary versus collective models of the household: Is it time to shift the burden of proof?' *World Bank Research Observer*, Vol.10: 1–19.

Alexandrova, A. and Braithwaite, J. (1997) 'A reality-based targeting of a poverty benefit in Russia: Three experiments with alternative approaches to means-testing', *PRMPO Working Paper*, Moscow and Washington DC: World Bank.

Antoninis, M. (2001a) 'Socio-economic status predictors for the adult morbidity and mortality project census in the Hai and Morogoro rural districts', mimeo paper, Oxford Policy Management Ltd., UK.

Antoninis, M. (2001b) 'Socio-economic status predictors for the adult morbidity and mortality project census in the Ilala and Temeke Districts of Dar es Salaam', mimeo paper, Oxford Policy Management Ltd., UK.

Atkinson, A.B. (1987) 'On the measurement of poverty', *Econometrica*, Vol. 55: 749–64.

Atkinson, A.B. (1989) *Poverty and Social Security*, Hemel Hempstead: Harvester Wheatsheaf.

Atkinson, A.B. and Micklewright, J. (1992), *Economic Transformation in Eastern Europe and the Distribution of Income*, Cambridge: Cambridge University Press.

Bartholomew, D., Steele, F., Moustkaki, I. and Galbraith, J. (2002) *The Analysis and Interpretation of Multivariate Data for Social Scientists*, London: Chapman & Hall/CRC.

Baulch, B. (1996) 'Neglected trade-offs in poverty measurement', *IDS Bulletin: Poverty, Policy and Aid*, Vol. 27, No. 1.

Beveridge, W. (1942) *Social Insurance and Allied Services*, (The Beveridge Report) Cmd 6404, London: HMSO.

- Bilsborrow, R. (1994) 'Towards a rapid assessment of poverty' in R. Van der Hoeven and R. Anker *Poverty Monitoring: An International Concern*, New York: St. Martin's Press, pp. 150–8.
- Bollen, K., Glanville, J. and Stecklov, G. (2002) 'Economic status proxies in studies of fertility in developing countries: Does the measure matter?' *Population Studies*, Vol. 56: 81–96.
- Bond, R. and Mukherjee, N. (2001) 'Livelihood Asset Status Tracking (LAST): A case from Rajasthan', University of Manchester: Institute for Development Policy and Management.
- Bruce, J. and Dwyer, D. (eds) (1988) *A Home Divided: Women and Income in the Third World*, Stanford, CA: Stanford University Press.
- Dargent-Molina, P., James, S., Strpoatz, D. and Savitz, D. (1994) 'Association between maternal education and infant diarrhoea in different household and community environments', *Social Science and Medicine*, Vol. 38, No. 2: 343–50.
- Deaton, A. (1997) *The Analysis of Household Surveys: A Microeconomic Approach to Development Policy*, Washington DC: Johns Hopkins University Press and the World Bank.
- Deaton, A. and Zaidi, S. (1999) *Guidelines for Constructing Consumption Aggregates For Welfare Analysis*, Washington DC: World Bank.
- DFID (2000) *Better Health for Poor People: Strategies for Achieving the International Development Goals*, London: DFID.
- Diamond, I., Matthews, Z. and Stephenson, R. (2001) 'The health of the poor: Towards a pro-poor measurement strategy', London: DFID Health Systems Resource Centre.
- Dreze, J. and Srinivasan P. (1995) 'Widowhood and Poverty in Rural India: Some Inferences from Household Survey Data', London: London School Of Economics.
- Evans, A. (1989) 'Gender issues in rural household economies', *IDS Discussion Paper*, No. 254, Brighton: Institute of Development Studies.
- Falkingham, J. (1999) 'Measuring household welfare: Problems and pitfalls with household surveys in Central Asia', *MOCT-MOST*, Vol. 9: 379–93.
- Falkingham, J. (2000) 'A profile of poverty in Tajikistan', *ESRC Centre for the Analysis of Social Exclusion Discussion Paper*, No. 39, London: London School of Economics.

Falkingham, J. (forthcoming) 'Inequality in access to health care in transition: The case of maternal health services in Tajikistan', *Health Policy and Planning*.

Filmer, D. and Pritchett, L. Z. (1998) 'Estimating wealth effects without income or expenditure data – or tears: Educational enrolment in India', *World Bank Policy Research Working Paper*, No. 1994, Washington DC: World Bank (also published in *Demography* (2001) Vol. 38, No. 1).

Filmer, D. and Pritchett, L. Z. (1999) 'The effect of household wealth on educational attainment: Evidence from 35 countries', *Population and Development Review*, Vol. 25, No. 1.

FONCODES (1995) *Mapa de Pobreza en Peru*, Lima: ONCODES.

Friedman, M. (1957) *A Theory of the Consumption Function*, Princeton: Princeton University Press.

Gardiner, K., Hills, J., Falkingham, J., Lechene V. and Sutherland, H. (1995) 'The effects of differences in housing and health care systems on international comparisons of income distributions', *Welfare State Programme Discussion Paper*, WSP/110., London: London School of Economics.

Glewwe, P. and Gaag, J. (1988) *Confronting Poverty in Developing Countries: Definition, Information and Policies*, Washington DC: World Bank.

Government of El Salvador (1995) 'Priorizacion de municipios a partir de datos censales', San Salvador.

Grandin, B. (1998) *Wealth Ranking in Smallholder Communities: A Field Manual*, London: Intermediate Technology Publications.

Grosh, M. and Baker, J. (1995) 'Proxy means tests for targeting social programs: Simulations and speculation', *LSMS Working Paper*, No. 118, Washington DC: World Bank.

Grosh, M. and Glewwe P. (2000) *Designing Household Survey Questionnaires for Developing Countries: Lessons from 15 Years of the Living Standards Measurement Study*, Washington DC: World Bank.

Grosh, M. and Glinskaya (1998) 'Proxy means testing and social assistance in Armenia', *LSMS Working Paper*, No. 136, Washington DC: World Bank.

- Grosh, M. and Munoz, J. (1996) 'A manual for planning and implementing the Living Standards Measurement Survey', *LSMS Working Paper*, No. 126, Washington DC: World Bank.
- Guilkey, D. and Jayne, S. (1997) 'Fertility transition in Zimbabwe: Determinants of contraceptive use and method choice', *Population Studies*, Vol. 51, No. 2: 173–90.
- Gwatkin, D. (2000) 'Health inequalities and the health of the poor: What do we know? What can we do?', *WHO Bulletin*, January.
- Gwatkin, D. and Pande, R. (1999) *Poor-Rich Differences with Respect to Health, Nutrition and Population*, Washington DC: World Bank.
- Hentschel, J. and Lanjouw, P. (1996) *Constructing an Indicator of Consumption for the Analysis of Poverty: Principles and Illustrations with Reference to Ecuador*, Washington DC: World Bank.
- Hentschel, J., Olsen Lanjouw, J., Lanjouw, P. and Poggi, J. (2000) 'Combining census and survey data to trace the spatial dimensions of poverty: A case study of Ecuador', *The World Bank Economic Review*, Vol. 14, No. 1: 147–65.
- Jayaraman, R. and Lanjouw, P. (1998) 'The evolution of poverty and inequality in Indian villages', *World Bank Policy Research Working Paper*, No. 1870, Washington DC: World Bank.
- Jensen, E. (1996) 'The fertility impact of alternative family planning distribution channels in Indonesia', *Demography*, Vol. 33, No. 2: 153–65.
- Kandiyoti, D. (1999) 'Poverty in transition: An ethnographic critique of household surveys in post-Soviet Central Asia', *Development and Change*, Vol. 30: 499–524.
- Kauser, F., Griffiths, P. and Matthews, Z. (1999) 'Poverty and maternal health care utilisation in Maharashtra: Associated influences on infant mortality and morbidity', *Social Statistics Working Paper*, 1999–04, Southampton: University of Southampton.
- Lanjouw, P. and Ravallion, M. (1995) 'Poverty and household size', *Economic Journal*, Vol. 105: 1415–34.
- Lanjouw, P., Milanovic, B. and Paternostro, S. (1998), 'Poverty in the transition economies: A case of children pitted against the elderly?' mimeo, Development Research Group, World Bank.

Lewis, M. (2002) 'Informal health payments in Eastern Europe and Central Asia: Issues, trends and policy implications', in E.Z. Mossialos, Z.A. Dixon, J. Figueras, and J. Kutzin (eds) *Financing Health Care and Long Term Care in Europe* Buckingham: Open University Press, pp.184–205.

McGee, R. (1998) 'Looking at poverty from different points of view: A Colombian case study', PhD thesis, University of Manchester.

McGee, R. and Brock, K. (2001) 'From poverty assessment to policy change: Processes, actors and data', *IDS Working Paper*, No. 133, Brighton: Institute of Development Studies.

McKinley, T. (1997) 'Beyond the line: Implementing complementary methods of poverty measurement', *UNDP Technical Support Document*.
<http://www.undp.org/poverty/publications/tsd/tsd3/tsd3.pdf>

Micklewright, J. and Stewart, K. (2001) 'Child well-being in the EU – and enlargement to the East', in K. Vleminckx and T. Smeeding (eds) *Child Well-being, Child Poverty and Child Policy in Modern Nations*, Bristol: The Policy Press, pp. 129–50.

Montgomery, M., Gragnolati, M., Burke, K. and Paredes, E. (2000) 'Measuring living standards with proxy variables', *Demography*, Vol. 37, No. 2: 155–74.

Moore, H. (1992) 'Households and gender relations: The modelling of the economy', in S. Ortiz and S. Lees (eds) *Understanding Economic Process*, New York: University Press of America.

Moser, C. (1998) 'The asset vulnerability framework: Reassessing urban poverty reduction strategies', *World Development*, Vol. 26, No. 1: 1–19.

Moser, C. and Holland, J. (1997) *Household Responses to Poverty and Vulnerability: Volume 4: Confronting Crisis in Chawana, Lusaka Zambia*, Washington DC: World Bank.

Munro, B.H. (1997) *Statistical Methods for Health Care Research*, New York: Lippincott.

Navajas, S., Schreiner, M., Meyer, R., Gonzalez-Vega, C. and Rodriguez-Meza, J. (2000) 'Microcredit and the poorest of the poor: Theory and evidence from Bolivia', *World Development*, Vol. 20, No. 2: 333–46.

Norton, A., Bird, B. and Brock, K. (2001) *A Rough Guide to PPAs: Participatory Poverty Assessment, A Guide to Theory and Practice*, London: DFID.

OECD (1996) *Shaping the 21st Century: The Contribution of Development Cooperation*, Paris: DAC/OECD.

Olson Lanjouw, J. (1997) 'Behind the line: De-mystifying poverty lines', *UNDP Technical Support Document*.

<http://www.undp.org/poverty/publications/tsd/tsd3/tsd3.pdf>

OPML (2001) 'Income and poverty status predictors for Tanzania', paper produced by National Bureau of Statistics, Tanzania and Oxford Policy Management Ltd., UK, with support from the UK Department for International Development (unpublished work, but available as mimeo from the authors).

Pahl, J. (1995) 'His money, her money: Recent research on financial organisation in marriage', *Journal of Economic Psychology*, Vol. 16, No. 3: 361–76.

Piachaud, D. (1987) 'Problems in the definition and measurement of poverty', *Journal of Social Policy*, Vol. 16: 147–64.

Popkin, B., Baturin, A., Mozhina, M. and Mroz, T. (1996) 'The Russian federation subsistence income level: The development of regional food baskets and other methodological improvements', Carolina: University of North Carolina. Available at <http://www.cpc.unc.edu/projects/rfms>.

Pradhan, M. (2000) 'How many questions should be in a consumption questionnaire? Evidence from a repeated experience in Indonesia', *Cornell Food and Nutrition Program Working Paper*, No. 112, Ithaca, NY: Cornell University Press.

Ravallion, M. (1992) 'Poverty comparisons: A guide to concepts and methods', *LSMS Working Paper*, No. 88, Washington DC: World Bank.

Ravallion and Chao (1989) 'Targeted policies for poverty alleviation under imperfect information: Algorithms and applications', *Journal of Policy Modelling*, Vol.11: 213–24.

Sahn, D. and Stifel, D. (2000). 'Poverty comparisons over time and across countries in Africa', *World Development*, Vol. 28, No. 12: 2123–55.

Sahn, D. and Stifel D. (2001). 'Exploring alternative measures of welfare in the absence of expenditure data', mimeo paper, Cornell University.

Sandiford, P., Cassel, J., Montenegro, M. and Sanchez, G. (1995) 'The impact of women's literacy on child health and its interaction with access to health services', *Population Studies*, Vol. 49: 5–17.

Scott, J. (1985) *Weapons of the Weak: Everyday Forms of Peasant Resistance*, London: Yale University Press.

Scott, C. and Amenuvegbe, B. (1990) 'Effect of recall duration on reporting of household expenditures: An experimental study in Ghana', *Social Dimensions of Adjustment in Sub-Saharan Africa Working Paper*, No. 6, Washington DC: World Bank.

Scott, J. (1985) *Weapons of the Weak: Everyday Forms of Peasant Resistance*. London: Yale University Press.

Sen, A.K. (1985) *Commodities and Capabilities*, Amsterdam: North Holland.

Sen, A.K. (1987) 'The Standard of Living: Lecture II, Lives and Capabilities', in G. Hawthorn (ed.) *The Standard of Living*, Cambridge: Cambridge University Press, pp. 20–38.

Sen, A.K. (1999) *Development as Freedom*, Oxford: Oxford University Press.

Simanowitz, A. (2000) 'Targeting the poor: A comparison between participatory and visual methods', *Small Enterprise Development: An International Journal*, Vol. 11, No. 1, March.

Simanowitz, A., Nkuna, B. and Kasim, S. (2000) 'Overcoming the obstacles of identifying the poorest families', paper commissioned for the Microcredit Summit (available from www.microcreditsummit.org/papers/povertypaper.htm).

Vogler, C. (1998) 'Money in the household: Some underlying issues of power', *The Sociological Review*, Vol. 46, No. 4.

World Bank (1996), *Ecuador Poverty Report*, World Bank Country Study, Washington DC: World Bank.

World Bank (2000) *Making Transition Work for Everyone*, Washington DC: World Bank.

Wratten, E. (1995) 'Conceptualising urban poverty', *Environment and Urbanisation*, Vol. 7, No. 1: 11–36.

Zeller, M., Sharma, M., Henery, C. and Lapenu, C. (2001). 'An operational tool for evaluating poverty outreach of development policies and projects', *IFPRI Discussion Paper*, No. 111, Washington DC: IFPRI.



Annex 1: The Millennium Development Goals, targets and indicators

Goals and targets	Indicators
Goal 1: Eradicate extreme poverty and hunger	
Target 1: Halve, between 1990 and 2015, the proportion of people whose income is less than US\$1 a day	Proportion of population below US\$1 per day Poverty gap ratio [incidence x depth of poverty] Share of poorest quintile in national consumption
Target 2: Halve, between 1990 and 2015, the proportion of people who suffer from hunger	Prevalence of underweight children (under five years of age) Proportion of population below minimum level of dietary energy consumption
Goal 2: Achieve universal primary education	
Target 3: Ensure that by 2015, children everywhere, boys and girls alike, will be able to complete a full course of primary schooling	Net enrolment ratio in primary education Proportion of pupils starting grade 1 who reach grade 5 Literacy rate of 15–24 year-olds
Goal 3: Promote gender equality and empower women	
Target 4: Eliminate gender disparity in primary and secondary education, preferably by 2005, and to all levels of education no later than 2015	Ratio of girls to boys in primary, secondary and tertiary education Ratio of literate females to males of 15–24 year-olds Share of women in wage employment in the non-agricultural sector Proportion of seats held by women in national parliament
Goal 4: Reduce child mortality	
Target 5: Reduce by two-thirds, between 1990 and 2015, the under-five mortality rate	Under-five mortality rate Infant mortality rate Proportion of one-year-old children immunised against measles

Goals and targets	Indicators
Goal 5: Improve maternal health	
Target 6: Reduce by three-quarters, between 1990 and 2015, the maternal mortality ratio	Maternal mortality ratio Proportion of births attended by skilled health personnel
Goal 6: Combat HIV/AIDS, malaria and other diseases	
Target 7: Have halted by 2015, and begun to reverse, the spread of HIV/AIDS	HIV prevalence among 15–24 year-old pregnant women Contraceptive prevalence rate Number of children orphaned by HIV/AIDS
Target 8: Have halted by 2015, and begun to reverse, the incidence of malaria and other major diseases	Prevalence and death rates associated with malaria Proportion of population in malaria risk areas using effective malaria prevention and treatment measures Prevalence and death rates associated with tuberculosis Proportion of tuberculosis cases detected and cured under Directly Observed Treatment Short Course (DOTS)
Goal 7: Ensure environmental sustainability*	
Target 9: Integrate the principles of sustainable development into country policies and programmes and reverse the loss of environmental resources	Proportion of land area covered by forest Land area protected to maintain biological diversity GDP per unit of energy use (as proxy for energy efficiency) Carbon dioxide emissions (per capita) [Plus two figures of global atmospheric pollution: ozone depletion and the accumulation of global warming gases]
Target 10: Halve by 2015 the proportion of people without sustainable access to safe drinking water	Proportion of population with sustainable access to an improved water source
Target 11: By 2020 to have achieved a significant improvement in the lives of at least 100 million slum dwellers	Proportion of people with access to improved sanitation Proportion of people with access to secure tenure [Urban/rural disaggregation of several of the above indicators may be relevant for monitoring improvement in the lives of slum dwellers]
Goal 8: Develop a Global Partnership for Development*	
Target 12: Develop further an open, rule-based, predictable, non-discriminatory trading and financial system	

Goals and targets

Includes a commitment to good governance, development, and poverty reduction – both nationally and internationally

Target 13: Address the special needs of the LDCs

Includes: tariff- and quota-free access for LDC exports; enhanced programme of debt relief for heavily indebted poor countries (HIPC) and cancellation of official bilateral debt; and more generous ODA for countries committed to poverty reduction

Target 14: Address the special needs of landlocked countries and small island developing states (through Barbados Programme and 22nd General Assembly provisions)

Target 15: Deal comprehensively with the debt problems of developing countries through national and international measures in order to make debt sustainable in the long term

Target 16: In cooperation with developing countries, develop and implement strategies for decent and productive work for youth

Target 17: In cooperation with pharmaceutical companies, provide access to affordable, essential drugs in developing countries

Target 18: In cooperation with the private sector, make available the benefits of new technologies, especially information and communications

Indicators

Some of the indicators listed below will be monitored separately for the least developed countries (LDCs), Africa, landlocked countries and small island developing states.

Official Development Assistance (ODA)

Net ODA as percentage of DAC donors' gross national income [targets of 0.7 per cent in total and 0.15 per cent for LDCs]

Proportion of ODA to basic social services (basic education, primary health care, nutrition, safe water and sanitation)

Proportion of ODA that is untied

Proportion of ODA for environment in small island developing states

Proportion of ODA for transport sector in land-locked countries

Market access

Proportion of exports (by value and excluding arms) admitted free of duties and quotas

Average tariffs and quotas on agricultural products and textiles and clothing

Domestic and export agricultural subsidies in OECD countries

Proportion of ODA provided to help build trade capacity

Debt Sustainability

Proportion of official bilateral HIPC debt cancelled
Debt service as a percentage of exports of goods and services

Proportion of ODA provided as debt relief

Number of countries reaching HIPC decision and completion points

Unemployment rate of 15–24 year-olds

Proportion of population with access to affordable, essential drugs on a sustainable basis

Telephone lines per 1000 people

Personal computers per 1000 people

Other indicators TBD

** The selection of indicators for Goals 7 and 8 is subject to further refinement.
Correct as of November 2001.*

Annex 2: Selected research using proxy measures of economic welfare

Author(s)	Title	Data source	Proxy measure of economic welfare
A. Razzaque, N. Alum, L. Wai and A. Foster (1990)	'Sustained effects of the 1974–5 famine on infant and child mortality in a rural area of Bangladesh', <i>Population Studies</i> , 44(1): 145–54.	Matlab Demographic Surveillance System	Additive index of durables, including quilts, hurricane lamps, radio, watches and the receipt of cash remittances.
M. Brockerhoff (1990)	'Rural to urban migration and child survival in Senegal', <i>Demography</i> , 27(4): 601–16.	Senegal DHS 1986	Type of toilet facilities and source of drinking water [model also included region, mother's marital status and occupation, and spouse's occupation].
J. Knodel and M. Wongsith (1991)	'Family size and children's education in Thailand: evidence from a national sample' <i>Demography</i> , 28(1): 119–31.	Thailand DHS 1987	Wealth index derived from types of vehicles owned, flooring, toilet facility.
G. Guo and L. Grunmmer-Strawn (1993)	'Child mortality among twins in less developed countries', <i>Population Studies</i> , 47(3): 495–510.	Demographic and Health Surveys for 26 countries	Owns car or TV [model also included urban/rural residence, mother's and spouse's education, husband's occupation (agricultural or manual)].
K. Bollen, D. Guilkey and T. Morz (1995)	'Binary outcomes and endogenous explanatory variables: tests and solutions with an application to the demand for contraceptive use in Tunisia', <i>Demography</i> , 32(1): 111–31.	Tunisia DHS 1988	Sum of household assets.
P. Sandiford, J. Cassel, M. Montenegro and G. Sanchez (1995)	'The impact of women's literacy on child health and its interaction with access to health services', <i>Population Studies</i> , 49: 5–17.		Enters number of socio-economic variables separately.

Author(s)	Title	Data source	Proxy measure of economic welfare
I. Speizer (1995)	'A marriage trichotomy and its applications', <i>Demography</i> , 32(4): 533–42.	Cameroon DHS 1991	Index containing type of flooring, ownership of durables (radio, bicycle, TV, motorcycle, car, stove, refrigerator), access to electricity.
E. Jensen (1996)	'The fertility impact of alternative family planning distribution channels in Indonesia', <i>Demography</i> , 33(2): 153–65.	Indonesia DHS 1991	Index of ownership of durables and quality of housing with equal weighting.
P. Muhuri (1996)	'Estimating seasonality effects on child mortality in Bangladesh', <i>Demography</i> , 33(1): 98–110.	Matlab Demographic Surveillance System	Whether household owns at least one of five durable goods or receives remittances.
D. Guiley and S. Jayne (1997)	'Fertility transition in Zimbabwe: determinants of contraceptive use and method choice', <i>Population Studies</i> , 51(2): 173–90.	Zimbabwe DHS	Sum of the number of consumer durables as well as indicator variables for land ownership, good drinking water and good sanitation facilities.
D. Filmer and L. Pritchett (1999)	'The effect of household wealth on educational attainment: evidence from 35 countries', <i>Population and Development Review</i> , 25(1).		
D. Sahn and D. Stifel (2000)	'Poverty comparisons over and across countries in Africa', <i>World Development</i> , 28(12): 2123–55.		
M. Montgomery, M. Gragnolati, K. Burke and E. Paredes (2000)	'Measuring living standards with proxy variables', <i>Demography</i> , 37(2): 155–74.	LSMS from five countries (Ghana, Jamaica, Pakistan, Peru and Tanzania)	Uses a series of separate indicator variables for durable goods (radio, TV, refrigerator, bicycle, motorcycle, car) and housing quality (access to clean water and electricity, type of toilet and flooring).

Author(s)	Title	Data source	Proxy measure of economic welfare
K. Bollen, J. Glanville and G. Stecklov (2001)	'Economic status proxies in studies of fertility in developing countries: does the measure matter?' <i>MEASURE Evaluation Working Paper</i> , No. 0138.	LSMS from Ghana and Peru	Compares two alternative measures: principal components score of various consumer durable goods; index constructed by summing ownership of the same set of goods.



Annex 3: Statistical methods for deriving weights for asset indices: Principal components, factor analysis and latent variable models

Principal Components Method

The principal components method statistical procedure has been employed by Filmer and Pritchett (1998) to determine the weights to be attributed to the variables within an asset index. The procedure 'locates and removes the few orthogonal linear combinations of the variables from a large number which best portray the common information'. The first principal component constitutes the linear index of variables with the most information which is common to all the variables.

The approach produces an asset index (AI) for each household based upon the following formula:

$$A_j = f_1 (a_{j1} - a_1) / (s_1) + \dots + f_n (a_{jn} - a_n) / (s_n)$$

Where for each household A_j

- f_1 = the scoring factor for the first asset as calculated by the procedure
- a_{j1} = the j th household's value for the first asset
- a_1 = mean of the first asset variable over all households
- s_1 = standard deviation of the first asset variable over all households
- n = total number of assets included in the procedure
- $j = 1, \dots, j$ households
- $n = 1, \dots, n$ household assets

The scoring factor is the weight assigned to each variable in the linear combination of the variables that constitute the first principal component. Each variable is normalised by its mean and standard deviation. The assumption being, as stated by Filmer and Pritchett (1998), that household long-run wealth determines the most common variation in asset variables. The mean value of the index is zero. In short, the weights are the standardised first principal component of the variance–covariance matrix of the observed household assets.

A note on appropriate alternative techniques for latent variable models

There is discussion as to the statistical approach that is most appropriate to use to derive weighting factors. Asset indices are commonly based on observed variables x_1, x_2, \dots, x_p

Factor analysis

Factor analysis is generally used to reduce or group a large number of variables into a smaller number of factors; i.e. data reduction for instrument development or subsequent analysis (Munro, 1997). The method is based upon matrix algebra.

Factor analysis has been employed to obtain a set of weights for each asset in order to construct an index of household assets (Sahn and Stifel, 2000). This method produces an AI for each household based on the following formula:

$$A_i = w_1 a_{i1} + \dots + w_k a_{ik}$$

Where for each household

a_{i1} = the i th household's value for the first asset recorded in the survey
 k = total number of assets included in the procedure
 w = weights to be estimated

Unlike the principal component method, factor analysis calculates the covariance of the assets in terms of a significantly smaller number of hypothetical common factors (Sahn and Stifel, 2000). Furthermore, it allows for asset-specific influences to explain the variances; i.e. all of the common factors are not forced to explain the entire covariance matrix. However, the two approaches do rank households similarly.

Using factor analysis, an explicit structure is imposed from the outset. The structural model here includes one factor because the assumption is that only one common factor explains the variance in the ownership of the set of assets. Sahn and Stifel (2000) assume that this common factor is a measure of economic status, i.e. welfare. The ownership of the observed assets is a linear function of the unobserved common factor for each household and the unobserved noise component.

Structural model:

$$a_{ik} = b_k c_i + u_{ik}$$

where

b_k = observed asset for each household
 c_i = unobserved common factor for each household
 u_{ik} = unobserved noise component (or unique element)
 $i = 1, \dots, N$ households
 $k = 1, \dots, K$ household assets

variables which are binary (taking values 0 or 1). It is argued that these are related to a latent variable y , which is metrical. In this case, Bartholomew et al. (2002) argue that the appropriate technique to use is latent trait analysis (see below) rather than factor analysis or principal component analysis.

For example, the factor analysis model is

$$x_i = \alpha + \beta y + e_i \quad (i=1, \dots, p), \text{ where } p = \text{denotes the total number of observed items.}$$

The factor analysis model assumes e_i follow a normal distribution with mean 0 and

variance σ^2 , y is assumed to have a standard distribution $N(0,1)$. Since y and e_j can take any value and are independent of each other, x_j can also take any value. Therefore, the linear factor model is invalid for categorical variables.

For more information see D. Bartholomew et al. (2002) *The Analysis and Interpretation of Multivariate Data for Social Scientists*, London: Chapman & Hall/CRC.

Classification of Latent Variable Models

Latent Variable (Y)	Observed Variables (X)	
	Metrical (Interval / Ratio)	Categorical (Nominal / Ordinal)
Metrical (Interval / Ratio)	Factor Analysis	Latent Trait Analysis
Categorical (Nominal / Ordinal)	Latent Profile Analysis	Latent Class Analysis

Source: Bartholomew, D. et al. (2002: 146)



Annex 4: Steps in designing a proxy means test

1. Measuring household welfare

The first step in designing a proxy means test is to define the measure of household welfare. This requires a full income and expenditure survey such as the LSMS.

2. Identifying correlates of household welfare

The next step in formulating a proxy means test is to identify a set of variables that correlate well with household welfare (per capita expenditure). In selecting the variables it is important to take three factors into account. First, they must be closely correlated with consumption to maximise accuracy in prediction and hence in targeting. Second, from a programmatic point of view they must be easily measurable. Third, they need to be easily verifiable. Good predictors of consumption that cannot be measured or verified will undermine the administrative feasibility of the programme.

Most studies then use stepwise ordinary least squares (OLS) regression to predict expenditure (see Grosh and Baker (1995) for a discussion on this).

In effect, this is equivalent to estimating a consumption function where $y_i = a + bx_i + e_i$.

There are a number of problems in using OLS to predict consumption. First, OLS assumes that the covariance of x_i and e_i is zero, which may in fact not be true. Second, many of the independent variables on the right-hand side are endogenous. That is, the decisions the household makes concerning them are not independent of the decisions that determine the dependent variable; i.e. household welfare. Finally, as Grosh and Baker (1995) point out, OLS does not minimise poverty *per se* but rather minimises the squared errors between the observed and predicted levels of welfare.

However, it can be argued that the disadvantages of OLS are outweighed by its advantages. Given that the primary concern is to identify who is poor rather than explaining why they are poor, problems of endogeneity may not be so important. Furthermore, OLS copes well with the large numbers of variables and continuous variables that are needed for developing a proxy-based means test. Most importantly, however, from a practical point of view, is the fact that policymakers and the general public can easily understand the results. Whilst Ravallion and Chao's (1989) algorithm directly minimises poverty, and so theoretically may be a preferable tool for designing a transfer scheme, it is cumbersome to use when a large number of predictive variables

are available and, more importantly, is unfamiliar to policymakers (Grosh and Baker, 1995).

3. Establishing eligibility

Once the equation has been specified, it is relatively straightforward to use the predicted household welfare level from the regression equation to assign households to the eligible or ineligible groups. Separate equations can be estimated for different regions and for rural and urban areas.

The decision as to where to set the cut-off for eligibility (or the 'poverty line') is essentially arbitrary, determined by policy and factors such as available budgetary resources.

Grosh and Glinskaya (1998) identify six classes of independent variables that are predicted to correlate with poverty:

- location
- household composition
- social categories (such as student or pensioner status)
- housing quality
- ownership of assets and consumer durables
- employment and verifiable income-related variables.

Variables:

- household composition and characteristics
 - age of head of household (possibly age-squared)
 - sex of head of household
 - number of children under 1.5 in household
 - number of children 1.5 to 4 years old in household
 - number of children aged 5 to 16 in household
 - number of people aged 65 and over
 - pensioner living alone
 - dummy for ethnicity
 - dummy for educational level of head
- social categories
 - number of student aged over 16
 - number of pensioners
 - number of disabled (1 if in receipt of disability pension, 0 otherwise)
 - number of orphans (1 if in receipt of 'pension in case of loss of breadwinner, 0 otherwise)

- housing quality
 - household lives in room or bed in dormitory (1 yes, 0 otherwise)
 - draws water from spring, river etc., rainwater or other
 - number with centralised supply of hot water
 - number of bathing facilities in dwelling
 - no electricity
 - no centralised gas
 - heats home from coal or wood stove

- ownership of assets
 - household has land (1, 0 otherwise)
 - total amount of land in hectares
 - household involved in raising livestock, poultry, bees etc. (1, 0 otherwise)
 - household has 1 cow
 - household has 2 cows
 - household has 3+ cows
 - household has pigs
 - household has sheep
 - household has 1 horse
 - household has 2 horses
 - household has 3+ horses
 - household has poultry
 - automatic washing machine
 - radio
 - camera
 - car
 - sewing machine
 - bike

- employment and income-related variables.
 - employment status dummies
 - verifiable income – wages from formal sector, cash benefits
 - whether or not household has received remittances.



Annex 5: The Consultative Group to Assist the Poorest: recommended questionnaire

Assessing Living Standards of Households

International Food Policy Research Institute

A study sponsored by the Consultative Group to Assist the Poorest (CGAP)

Section A: Household identification

A1. Date (mm/dd/yyyy) ___/___/___

A2. Division code

A3. MFI unit code

A4. Group code

A5. Group name

A6. Household code:

A7. Household chosen as (1) client of micro finance institution (MFI) or (2) non-client of MFI?

A8. Is household from replacement list? (0) No (1) Yes

A9. If yes, the original household was (1) not found or (2) unwilling to answer, or (3) client status was wrongly classified

A10. Name of respondent

Name of the household head

Address of the household

A11. Interviewer code A12. Date checked by supervisor (mm/dd/yyyy) ___/___/___

A13. Supervisor signature _____

Section B: Family structure

ID code	Name (HH head)	Status of the head of the HH ^a	Relation to head of HH ^b	Sex ^c	Age	Max. level of schooling ^d	Can write ^e	Main occupation, current year ^f	Current member of MFI ^e	Amount of loan borrowed	Clothes/ footwear expenses for the last 12 months in local currency ^g
1											
2											
3											
4											
5											
6											
7											
8											

^a (1) single; (2) married, with the spouse permanently present in the household; (3) married with the spouse migrant; (4) widow or widower; (5) divorced or separated; (6) living mostly away from home but contributing regularly to household.

^b (1) head of the household; (2) spouse; (3) son or daughter; (4) father or mother; (5) grandchild; (6) grandparents; (7) other relative; (8) other non-relative.

^c (1) male; (2) female.

^d (1) less than primary 6; (2) some primary; (3) completed primary 6; (4) attended technical school; (5) attended secondary; (6) completed secondary; (7) attended college or university.

^e (0) no; (1) yes.

^f (1) self-employed in agriculture; (2) self-employed in non-farm enterprise; (3) student; (4) casual worker; (5) salaried worker; (6) domestic worker; (7) unemployed, looking for a job; (8) unwilling to work or retired; (9) not able to work (handicapped).

^g In order to get an accurate recall, the clothes and footwear expenses for each adult are preferably asked in the presence of the spouse of the head of the household. If the clothes were sewn at home, provide costs of all materials (thread, fabric, buttons, needles).

Section C: Food-related indicators

(Both the head of the household and his or her spouse should be present when answering for this section)

C1. Did any special event occur in the last two days (for example, family event, guests invited)? (0) No (1) Yes

C2. If no, how many meals were served to the household members *during the last 2 days*?

C3. If yes, how many meals were served to the household members *during the 2 days preceding the special event*?

C4. Were there any special events in the last *seven days* (for example, family event, guests invited)? (0) No (1) Yes

(If 'Yes', the 'last seven days' in C5 and C6 should refer to the week preceding the special event.)

C5. During the *last seven days*, for how many *days* were the following foods served in a main meal eaten by the household?

Luxury food	Number of days served
Luxury food 1	<input type="text"/>
Luxury food 2	<input type="text"/>
Luxury food 3	<input type="text"/>

C6. During the *last seven days*, for how many *days* did a main meal consist of an inferior food only?

C7. During the *last 30 days*, for how many days did your household not have enough to eat everyday?

(0) No (1) Yes

C 8. During the *last 12 months*, for how many months did your household have at least one day without enough to eat?

(0) No (1) Yes

C9. How often do you purchase the following?

Staple	Frequency served
Staple 1	<input type="text"/>
Staple 2	<input type="text"/>
Staple 3	<input type="text"/>

- (1) Daily (2) Twice a week (3) Weekly (4) Fortnightly (5) Monthly
(6) Less frequently than a month
- C10. For how many weeks do you have a stock of *local staples* in your house?
- C11. If your household earnings increased by (US\$10–\$20), how much of that would you spend on purchasing additional food? (Estimate amount as 5 per cent of GDP per capita.)
- (Note: Does not include alcohol and tobacco)

Section D. Dwelling-related indicators

(Information should be collected about the dwelling in which the family currently resides)

- D1. What is the ownership status of dwelling? (1) Owned (2) Given by relative or other to use (3) Provided by government (4) Rented
- D2. How many rooms does the dwelling have? (Include detached rooms in same compound if same household)
- D3. What type of roofing material is used in main house? (1) Tarpaulin, plastic sheets, or branches and twigs (2) Grass (3) Stone or slate (4) Iron sheets (5) Brick tiles (6) Concrete
- D4. What type of exterior walls does the dwelling have? (1) Tarpaulin, plastic sheets or branches and twigs (2) Mud walls (3) Iron sheets (4) Timber (5) Brick or stone with mud (6) Brick or stone with cement plaster
- D5. What type of flooring does the dwelling have? (1) Dirt (2) Wood (3) Cement (4) Cement with additional covering
- D6. Is the dwelling built on squatter land? (0) No (1) Yes
- D7. What is the observed structural condition of main dwelling? (1) Seriously dilapidated (2) Need for major repairs (3) Sound structure
- D8. What is the electricity supply? (1) No connection (2) Shared connection (3) Own connection
- D9. What type of cooking fuel source primarily is used? (1) Dung (2) Collected wood (3) Purchased wood or sawdust (4) Charcoal (5) Kerosene (6) Gas (7) Electricity
- D10. What is the source of drinking water? (1) Rainwater (2) Dam (3) Pond or lake (4) River or stream (5) Spring (6) Public well—open (7) Public well—sealed with pump (9) Well in residence yard (9) Piped public water (10) Bore hole in residence

D11. What type of toilet facility is available? (1) Bush, field, or no facility (2) Shared pit toilet (3) Own pit toilet (4) Shared, ventilated, improved pit latrine (5) Own improved latrine (6) Flush toilet

E. Other asset-based indicators

E1. Area of land owned: agricultural _____ non-agricultural _____
 Value of land owned: agricultural _____ non-agricultural _____

E2. Number and value of selected assets owned by household (ask household to identify any assets purchased with MFI loan and eliminate these from the table below)

Asset type and code	Number owned	Resale value at current market price
Livestock		
1. Cattle and buffalo		
2. Adult sheep, goats and pigs		
3. Adult poultry and rabbits		
4. Horses and donkeys		
Transportation		
5. Cars		
6. Motorcycles		
7. Bicycles		
8. Other vehicles		
9. Carts		
Appliances and electronics		
10. Televisions		
11. Video cassette recorders		
12. Refrigerators		
13. Electric or gas cookers		
14. Washing machines		
15. Radios		
16. Fans		