

# Human Development Research Paper 2010/43 Progress in Health around the World

David Canning





United Nations Development Programme Human Development Reports Research Paper

October 2010

# Human Development Research Paper 2010/43 **Progress in Health around the World**

David Canning

United Nations Development Programme Human Development Reports Research Paper 2010/43 October 2010



# Progress in Health around the World

David Canning

The Author is Professor of Economics and International Health at the Harvard School of Public Health E-mail: <u>dcanning@hsph.harvard.edu</u>

Comments should be addressed by email to the author.

## Abstract

Health is a key component of the human development index. This paper looks at how health is measured, how the level of health across countries is converging, and which countries are outliers to this global trend. We argue that conceptually health measures should account for illness as well as mortality. However, in practice we show that population mortality and illness measures tend to move closely together, allowing us to use life expectancy as a reasonable proxy for population health.

Overall health is improving, and over the last 40 years life expectancy has been converging, with larger gains taking place in countries that initially had lower levels of life expectancy. We show, however, that a detailed analysis gives a more complex picture. Rather than a long term pattern of global convergence we see two distinct groups of countries in the data, clustering around different long run levels of life expectancy.

We consider outliers from the general picture found in cross-country analysis. HIV/AIDS plays a large role in explaining the poor health performance of some countries particularly in Sub-Saharan Africa. HIV/AIDS has meant that from 1990 on the process of convergence in health has stopped and is being reversed.

Finally we argue that health improvements do not have to wait for national income to rise. Many countries have experienced large health gains without prior income gains, and in countries not affected by HIV/AIDS the last 40 years have largely been a success story in terms of achievements in health.

Keywords: health, life expectancy, human development.

JEL classification: I10, I30.

The Human Development Research Paper (HDRP) Series is a medium for sharing recent research commissioned to inform the global Human Development Report, which is published annually, and further research in the field of human development. The HDRP Series is a quick-disseminating, informal publication whose titles could subsequently be revised for publication as articles in professional journals or chapters in books. The authors include leading academics and practitioners from around the world, as well as UNDP researchers. The findings, interpretations and conclusions are strictly those of the authors and do not necessarily represent the views of UNDP or United Nations Member States. Moreover, the data may not be consistent with that presented in Human Development Reports.

### 1. Health in Human Development

There is wide spread agreement that heath is an important component of human development. Health was identified as a component of human development in the Human Development Report 1990 (United Nations Development Program 1991) and is a central part of the Human Development Index. The World Bank has shifted from an emphasis on promoting economic growth (e.g. Commission on International Development, 1969) to include a focus on health, education, and social exclusion (see World Development Report 2001). The Millennium Development Goals, adopted at the Millennium Summit of the United Nations in September 2000 focused on poverty, mortality, education, health, gender equality and environment as the key measures of development.

More recently The Commission on the Measurement of Economic Performance and Social Progress (2009) put forward eight distinct spheres of wellbeing in addition to consumption and wealth: health, education, personal activity, political voice and governance, social connectedness, environmental conditions, personal insecurity, and economic insecurity. It also argued for a focus on inequality in these indicators as well measures of their average levels.

While there seems to be general agreement that health is an important component of human development there is an issue about how exactly we should measure health. To some extent this is a question of the conceptual underpinning of the development measure we seek. Our theory of what development is, and of well being, should dictate the appropriate health measure. On the other hand we have the consideration that at present we only have few internationally comparable measures of health and in practice must base comparisons on these. While it is true we are limited in the set of health variables we can use, it is useful to discuss how well these measures correlate with the more meaningful underlying measure of health we would like to use.

This gap between theory and measurement is partly a matter of a conceptual gap – the health measure we use may be trying to measure something that is different for the measure we would wish in theory. However we also have measurement error; we may not perfectly capture the construct we are trying to capture.

The measure of health currently used in the Human Development Index is life expectancy. The period 1970-2005 has seen large improvements in life expectancy in most countries and convergence in life expectancy, with countries that had lower life expectancy in 1970 seeing larger gains in life expectancy subsequently. However, when we look at the data in more detail a more complex picture emerges. Instead of uniform convergence to a high level of life expectancy, there appear to be two separate groups of countries. One group has low life expectancy while the other has high life expectancy. Among the high life expectancy countries we see modest and fairly uniform gains in life expectancy over time. Among countries with low initial life expectancy increases in life expectancy are not a uniform and smooth catch up. Rather some countries that initially have low life expectancy seem to jump to join the high life expectancy regime, while others stagnate with low or little in the way of life expectancy gain, and sometimes even falling life expectancy.

As well as the general trends outlines above we have some countries which are outliers to the process. One set of outliers are the Sub-Saharan African countries with high levels of HIV/AIDS. The general patterns of pattern relative failure of countries with initially low life expectancy is exacerbated by the large number of HIV/AIDS deaths in Sub-Saharan but the phenomenon is not entirely due to HIV/AIDS; these countries are outliers to the process outlined above. The countries with high prevalence rates of HIV have seen little in life expectancy improvement and indeed some have seen absolute declines relative to 1970 levels. The other area in which there has been a relative failure to improve life expectancy has been in the former Soviet Republics. In contrast to these we have a number of success stories, countries with life expectancy gains far in excess of our model's predictions and sometimes involving a jump to low level health regime to the high level regime.

We also discuss the interrelationship between health and income. Income per capita is also part of the human development index and across countries higher levels of health and income go together. However the relationship is not close enough to take one as a proxy measure of the other. In addition, over the years 1970-2005 we see much larger improvements in health around the world than we would expect based solely on the increases in income over the period. Countries, even very poor countries, can improve their population health using direct health interventions even when incomes are not rising. It is important to realize that health improvements can be achieved with first waiting for income to rise.

Overall we have a fairly good picture of achievement in health. In most countries life expectancy has risen and the relatively faster rise in countries with initially low levels of health means that in these countries their human development index, relative to the leading country, will be rising. The great worry is the health crisis, particularly in Sub-Saharan Africa, being brought about by the high prevalence of HIV/AIDS. This is undoing significant gains that were being made up until 1990 and makes it difficult to see substantial health gains in these countries in the future without significant improvements in HIV prevention or treatment.

### 2. The concept of health

Life expectancy is the health measure used in the Human Development Index. We begin by considering the issue of whether life expectancy is the right measure of population health on conceptual grounds. Mathers et al. (2003) also consider this issue. It is clear that a longer life span is preferable to a shorter lifespan, but the quantity of lifespan says nothing about the quality of life. There are a number of approaches to adjusting life years lived by health status to get a better measure that accounts for illness. One approach is to use quality adjusted life years (QALYs) where individuals express the their preferences by valuing a the quality of a life year lived in a state of ill health as the fraction of a year lived in full health that would give them the same utility. Another is to use disability adjusted life years (DALYs) where a life year lived with disability is considered equal to a fraction of a year lived in full health, with the adjustment being made by an expert panel.

To some extent these two approaches to adjusting life years for ill health represent different ways of thinking about of welfare. One way is to use a utilitarian social welfare function. In this approach social welfare is defined as the sum of individual utilities. In a utility approach the right way to weight goods is in terms of individuals' willingness to trade them off for other things, depending on how much they add to utility. This leads to using QALYs. However, in the capabilities approach to measuring development we can think of welfare as being measured by the size of the choice set rather than the utility of what is chosen. In the capabilities approach we can think of healthy life span as a basic constraint that limits people's choice, and we want to measure the objective size of the choice set, independently of how people value the choices. This approach leads to a preference to use DALYs.

A related issue is that QALYs depend on individual tradeoffs and the estimated QALY adjustment for a particular disability may vary between countries. If this is the case two countries with the same level of disability may have different estimates of their health status if people in the two countries value a year of life lived in disability (in terms of life years lived in full health) differently. It seems undesirable that countries with the same objective measures of health should be ranked differently in terms of welfare because of different preferences; we should therefore establish worldwide average values of the QALY adjustment related to each disability. This is difficult to do, and requires widespread surveys of preferences, while DALY adjustments have been already been set for each disability.

In order to get a single measure of population health including ill health as well as death, we can calculate healthy life expectancy, weighting years lived in disability as a fraction of a year lived in full health, using the DALY approach. To do this we need data on mortality and also the prevalence of disease and the frequency of each type of disability associated with each disease as well as DALY weights for each disability. Figure 1 plots estimates of life expectancy against healthy life expectancy for 192 countries in 2002 using data from the World Health Report 2004 (World Health Organization 2004). We see a very close association between the two measures, with healthy life expectancy rising linearly with life expectancy. A regression of healthy life expectancy, HL, on life expectancy, L, using this data gives

$$HL = -3.859 + 0.936 L$$
(0.424) (0.006)

$$N = 192$$
 R<sup>2</sup> = 0.991

where we have standard errors of the estimates in parentheses.

The intercept is significantly different from zero and the coefficient on life expectancy is significantly lower than one. This implies that healthy life expectancy is not simply a proportion of life expectancy. For example, according to this linear relationship, when life expectancy is 40, then healthy life expectancy is 33.6 and the proportion of years in ill health is 0.16. In contrast, when life expectancy is 70 then healthy life expectancy is 61.6 so the proportion of years in ill health is 0.12. Figure 2 shows that the fraction of life spent in disability is relatively constant across countries with life expectancy below 60, but for countries where life expectancy is above 60 years the proportion of years in disability appears to decline as life expectancy rises.

In Figure 3we plot the expected years in disability against life expectancy. This shows that people living in countries with higher life expectancy expect more years of disability, up to a life expectancy of about 70. For life expectancies above 70 however, increased life expectancy seems to be associated with and lower number of years lived with disability. It appears that at low levels of health, as health improves, in terms of longer life spans, the onset of disability is also pushed back proportionately, so that the fraction of life spent in disability stays relatively constant. However at very high levels of life expectancy we see a "compression of morbidity", longer life spans are associated with a compression of the number of years spent disabled.

In most developed countries we have time series data showing this compression of morbidity (Fries, 2003). When life expectancy increases, healthy life expectancy increases more than proportionately, compressing the number of years lived with disability into a shorter fraction of the lifespan. This means that life expectancy increases in developed countries are generally very good news since they go hand in hand with greater healthy life expectancy and delays in the average age at which disability occurs. Unfortunately we lack similar time series evidence on how expected years in disability changes when life expectancy increases in developing countries. The cross-country evidence, shown in Figures 2 and 3, points to the expected age of onset of disability rising proportionately with life expectancy in these countries making life expectancy a fairly good proxy for healthy life expectancy.

In cost effectiveness studies in which health gains are measured in QALYs or DALYs we usually discount gains to future life expectancy by a social discount rate (often a rate of 3% per annum is used). We could apply the same logic to measures of life expectancy at birth and argue that survival at birth, which comes in the immediate future, is more valuable than survival at older ages which comes in the distant future. However discounting in this way has several problems. Firstly we may not want to discount health at the same rate as money, and secondly it is it unclear that the discount rate used by individuals in deciding between present and future consumption is appropriate as social discount rate for comparing across generations born at different times (see Kaplow 2007 for a discussion of these issues).

In addition, life expectancy is not measured for a cohort born today over its future. It is actually a synthetic measure constructed from current period age specific mortality rates, and is the life span a person would one would expect if they were exposed to this age specific mortality. If we think of life expectancy simply as a summary statistic, capturing current age specific mortality rates in a single number, there is no need to discount. However thinking of it as a summary measure of current mortality rates does raise the issue that it is more sensitive to changes in the infant mortality rate than to changes in mortality at older ages, since the "cost" of a death in terms of life expectancy foregone declines with age (Vaupel 1986).

There is also the issue of inequality in life spans. A particular level of life expectancy can represent very different age specific mortality patterns. For example, in one country everyone could live to age 70 while in another half the people could live to age 50 and the other half to age

90. Both these populations will have life expectancy 70, on average, but one has equal life spans while the other has very unequal life spans. We could think of the variation in life spans as undesirable inequality if different life spans are identified with different groups in the population. Alternatively if everyone has the same life expectancy the different life spans actually experienced could be viewed as undesirable risk (Edwards, 2008). In either case we might want a measure that considered not just life expectancy but also the spread of life span outcomes experienced by the population. Penalizing the spread of life span at high levels of life span are less valuable than gains at low spans, though now the "discount rate" can be thought of as a measure of social aversion to inequality or a measure of risk aversion. However, it should be noted that the issues of inequality and risk cannot really be dealt with in one dimension of wellbeing alone. When we consider inequality and risk we will be concerned with the joint distribution of health, income and education, since the welfare impact of deprivation are unlikely to be simply additive.

In addition to the issue of getting the right measure of health there is the issue of how health should be weighted in constructing the human development index. At present health, income and education get equal weights on one third each. If we take a social welfare approach to measuring human development we can ask how people value health improvements in terms of money units to get a sense of the relative importance of health and income in welfare. Becker, Philipson, and Soares (2005) estimate the money value of health improvements in each country based on estimates of willingness to pay for additional life years (Viscousi and Aldy 2003). They find that the value of life expectancy improvements between 1960 and 2000 were, on average, about the same as the value of income improvements. This implies that we should weight a countries health improvements roughly equally with is income improvements when thinking

about total welfare and is in line with the current weighting of income and health in the human development index.

#### **3.** Estimates of Life Expectancy

The human development index currently uses life expectancy as its measure of health. In this section we assume that life expectancy is the right measure and ask how well it is measured by current statistics. In theory, life expectancy can be calculated directly from age specific mortality rates. However when direct measures of age specific mortality are not available, or are unreliable, there are also indirect methods of estimating life expectancy. Demographic indicators such as population growth rates, and the age distribution, are closely linked to mortality rates and life expectancy, and data on such demographic indicators can be used to make inferences on the level of life expectancy. The United Nations constructs reasonable estimates of life expectancy that are consistent both with the direct evidence and with indirect indicators, using information from a variety of data sources in each country.

Measurement of mortality rates and demographic indicators can be based on vital registration data, age distributions in the census, and nationally representative survey information on infant mortality and deaths of other family members. All of these data sources have potential problems, due, for example, to under-reporting of deaths in vital registration, under-enumeration of the population and age misreporting in census data, and survey data may suffer from error due to small sample sizes. The complete set of estimates of life expectancy across countries and over time includes some interpolated or extrapolated data, particularly prior to 1980 (Bos, Vu, Stephens, Patience, 1992).

The introduction of the World Fertility Surveys in the 1970s, which were followed by the Demographic and Health Surveys from the mid 1980s onwards, have led to improved estimates of infant and under five mortality in many developing countries. Data on adult mortality rates are often less reliable in these countries (Hill 2003). When the availability of relevant direct data are limited, model life tables are used to provide indirect estimates life expectancy. For example when there is data only on infant mortality available model life tables can be used to impute life expectancy. This means that life expectancy estimates for developing countries are sometimes based on a simple transformation of their infant mortality rates (Deaton 2007). These transformations have changed over the last few years to take into account the change in age specific mortality pattern due to HIV/AIDS.

The underlying data on infant and under five mortality rates from household surveys may be less reliable if they are used to estimate child mortality retrospectively. While questions on births and child survival asked of mothers (conditional on these mothers still being alive) over the last five years are usually thought to be reasonable, calculating infant mortality rates on longer recall periods may be subject to recall bias. Issues of methods and measurement in estimating life expectancy are discussed in detail in Lopez et al. (2003). Even the best estimates are subject to a range of uncertainty and Daponte et al. (1997) discuss how to quantify this uncertainty. Given the imperfection of the estimates, Bayesian methods that impose some prior knowledge of the structure of the data may lead to improved mortality estimates; this approach is used by Girosi and King (2008).

In Figure 4 we plot under five mortality rates for Guatemala. Guatemala had Demographic and Health Surveys (DHS) in 1987, 1995 and 1998. These surveys tell a fairly consistent story, rates calculated using recall in a later DHS tend to match fairly closely the rates

found at the time in an older DHS. In addition, Guatemala has a vital registration and figures on under-five mortality from the registered deaths match the DHS estimates quite closely. There are a few very high estimates of under-five mortality in the 1960's but these are not matched by the vital registration data. While the consistency of the data from different sources is encouraging it does not mean that the mortality estimates derived from them are correct; in principle there could be the same bias occurring in each source.

In Figure 5 we plot estimates of under-five mortality based on data from Demographic and Health Surveys for Nigeria in 1990 and 2003 as well as mortality data from the World Fertility Survey (WFS) in 1981. While the data in figure 4 from different surveys agree quite well over time, the data for Nigeria for under-five mortality based on the three surveys differ markedly. In comparing the data from the 2003 DHS survey in Nigeria with data from the 1990 DHS survey we have the problem that when the data cover the same years they do not overlap. This may be due to recall bias in the later survey, or to one of the surveys not being representative of the overall population. We also have the problem that the recall estimates from the 1990 DHS survey are generally higher than those found at the time in the 1981 World Fertility survey. We are left of the problem of constructing a consistent time series for infant mortality in Nigeria from surveys that give conflicting evidence. Given the large role that underfive mortality rates play in determining life expectancy (Vaupel 1986) these examples demonstrate the type of issues that have to be addressed when constructing life expectancy estimates. In developed countries mortality at older ages plays a larger role in variations in life expectancy (White 2002).

These caveats on data quality mean that we should not draw too much in the way of inference from small differences in estimated life expectancies. The data may however be

sufficiently reliable to discern some broad movement in health. Until the advert of HIV/AIDS, infant mortality rates were falling, and life expectancy was rising worldwide, even in countries with little or no growth in income (Ahmad, Lopez, & Inoue, 2000, Cutler, Deaton and Lleras-Muney, 2006). In the following sections we shall investigate to what extent this represents convergence in health and what factors are driving these health gains.

Overall, our analysis points to some possible improvements in the measurement of health as a human development indicator. Conceptually there is a strong argument for using healthy life expectancy, adjusting life expectancy downward for years lived with disability, as our health metric. However this would require a major new data collection effort to collect data on the prevalence of disability. The strong linear relationship shown in Figure 1 suggests that life expectancy, which depends only on mortality and not morbidity, may in practice capture a large portion the actual variation in population health. We might also consider how to improve our life expectancy measure to adjust for inequality, or risk, due to the variance of life span outcomes. There is scope for improvement in data quality, particularly in developing countries where life expected is often modeled based on very sparse data rather than estimated from actual age specific mortality rates.

#### 4. Improvement and Convergence in Life Expectancy

The general consensus in the literature is that while income per gaps have been fairly constant over the last 50 years, health status is low health countries has been improving faster than in high health countries leading to a convergence in population health levels around the world (Deaton, 2004). The issue of convergence is important for the human development index since countries are measured relative to the leading country. Uniform improvements with no convergence will mean that average value of the human development index across countries will remain the same. However if there is convergence the average value of the index will rise as countries close with the leader.

In this section discuss three challenges to this consensus of convergence. First, the picture of convergence depends on which health measure we take, and is sensitive to transformation of the health measure. For example, log life expectancy may not be converging while life expectancy does converge. We show this dependence on functional transformation is fundamental and means we should use a conceptually correct measure of health so we are talking about convergence of interesting, meaningful, variables. Secondly, we show that convergence holds from 1970 to 1985 but since 1990 there has been large scale divergence. Thirdly, if we measure population health in terms of life expectancy we show that the picture is of two convergence clubs rather than uniform convergence over the period 1970-2005. All countries that had good levels of health in 1970, and some countries that had low levels, are converging towards a common high level of life expectancy. However there is a substantial group of countries, whose health status was low in 1970, that are converging together towards a much lower level of life expectancy

Health, as measured by life expectancy, has been improving in most countries over the last fifty years. In addition to this evidence of improvement on average, there is evidence that life expectancy is rising fastest in countries that had low life expectancy in 1970, leading to the view that life expectancy gaps between countries are narrowing, with the prospect of convergence in health in the long run (Deaton, 2004; Neumayer, 2003; Sab and Smith, 2002; Hobijn and Franses 2001).

13

One way to think about convergence in life expectancy is to ask if countries with lower initial life expectancy tend to see larger gains in life expectancy. In this case a regression of the change in life expectancy on the initial level of life expectancy will produce a negative coefficient  $\beta$  on life expectancy, countries with initially low life expectancy will tend to have larger increases in life expectancy (this is known as  $\beta$ - convergence). That is, we estimate the model

$$\Delta L_i = \alpha + \beta L_i + \varepsilon_i$$

Where  $\Delta L_i$  is the change in life expectancy and  $L_i$  is initial life expectancy. Figure 6 shows the relationship between life expectancy in 1970 and subsequent gains in life expectancy over the period 1970-2005. The data we use in this section is from Molina and Purser (2010) and gives life expectancy for 174 countries over the period 1970-2005.

The results, reported as model 1, in Table 1 show a simple OLS regression of the change in life expectancy on a constant and the initial level of life expectancy. Both Figure 6 and Table 1 suggest that there is  $\beta$ - convergence, the trend line in Figure 6 is downward sloping, and the estimate of  $\beta$ , the coefficient on initial health in 1970, is negative and statistically significant.

A difficulty with the concept of  $\beta$ - convergence is that it is not invariant to transformations of the data. To show this suppose we have

$$\Delta(\log L_i) = \log(1+\beta)$$

In this case log life expectancy is changing at a constant rate  $(1 + \beta)$  in each county and is not converging, since the rate of change is independent of the initial level of log life expectancy. Transforming this equation we can however derive

$$\Delta L_i = \beta L_i$$

This implies we may have no convergence in log life expectancy but rapid convergence in the level of life expectancy<sup>1</sup>. This issue is fundamental, convergence in the level of a variable does not imply that every positive transform of that variable is also converging. The only solution is to make sure that the health measure we use is the one we are interested in from a welfare perspective.

An alternative approach to thinking about convergence is to consider the standard deviation,  $\sigma$ , of life expectancy across countries and ask whether this measure decreases over time (" $\sigma$ -convergence")<sup>2</sup>. Figure 7 shows the standard deviation of life expectancy for the 174 countries in our sample. The standard deviation of life expectancy across countries fell between 1970 and 1985, but has risen since 1990. This rise is mainly due to the emergence of high HIV/AIDS mortality in countries that already had high mortality which has lead to widening gaps in life expectancy. Figure 8 plots the 10<sup>th</sup>, 25<sup>th</sup>, 50<sup>th</sup>, 75<sup>th</sup> and 90<sup>th</sup> percentiles of the life expectancy distribution between 1970 and 2005. We can see that there is substantial convergence between the 50<sup>th</sup> and 90<sup>th</sup> percentiles. However, since 1990 there have been almost no gains in life expectancy in the 10<sup>th</sup> to 25<sup>th</sup> percentiles, which is what lies behind the increasing standard deviation in life expectancy across countries.

<sup>&</sup>lt;sup>1</sup> An extreme version of this occurs with infant mortality rates. These are converging towards zero in most countries but the log infant mortality rates are not converging and may remain widely separated.

<sup>&</sup>lt;sup>2</sup>  $\beta$  -convergence is necessary, but not sufficient, for  $\sigma$  - convergence.

Even if we accept the evidence of improving and converging life expectancy over the period 1970-2005 taken as a whole as shown in Figure 6 there is a worry that these average trends mask considerable variation in the experience of individual countries. McMichael, McKee, Shkolnikov and Valkonen (2004) divide countries into three groups, those that have seen rapid improvement in life expectancy over the period, those that have seen relative stagnation in their life expectancy, and those that have seen sharp reversals and falling lifespan in recent years. Molina and Purser (2010) show that life expectancy is converging worldwide, but that this convergence is much more evident if African countries are excluded from the sample.

We argue that while, on average, countries with low life expectancy in the 1960's have seen the faster increases, the data tells a more complex story. Figure 9 plots the distribution of life expectancy in 1970 and 2005, using a kernel density estimator<sup>3</sup>. An examination of the distribution of life expectancy in 1970 reveals twin peaks; there are a group of countries clustered around a life expectancy of 45 with another group clustered around a life expectancy of 67. By 2005 the modes of both these clusters have moved up by about 10 years. While progress in both groups has been similar, a number of countries appear to have made the jump for the high mortality cluster to the low mortality cluster. The height of the high life expectancy cluster has increased while the density at the low cluster has fallen. Rather than a process of continuous convergence, the data suggest continuous advances within clusters, but with large advances in life expectancy in particular countries due to jumping between clusters.

The twin peaks in the distribution of health may represent a "mortality trap" that parallels the poverty trap that we see in the world income distribution. In this view there are multiple

<sup>&</sup>lt;sup>3</sup> This is, essentially, a smoothed histogram.

equilibria. There is a trap, with low income and high mortality, but countries can escape from this trap and converge on the high level equilibrium with high income and low mortality. An alternative view is that there is a unique equilibrium for each country which depends on that country's characteristics. This means some countries have characteristics that lock them into low mortality and high income while others have characteristics that give them high mortality and low income while by chance there are few countries with characteristics that give outcomes in between these extremes. Bloom, Canning, and Sevilla (2003) test a model where the twin peaks in the income distribution is due to multiple equilibria as against a model where different countries have different outcomes based on their characteristics, such as geography and climate. They find that the evidence favors multiple equilibria; countries with very similar characteristics can have very different outcomes.

We now test formally a model of two convergence clubs, allowing for jumps between clubs, against a model where all countries are converging following the same continuous (though non-linear) rule. Our first model is the simple linear form we have already discussed

Model 1: 
$$\Delta L_i = \alpha + \beta L_i + \varepsilon_i$$
 where  $\varepsilon_i$  is distributed  $N(0, \sigma^2)$ 

We take  $L_i$  to be initial life expectancy in 1970 and  $\Delta L_i$  to be the change in life expectancy over 1970-2005. A negative coefficient on initial life expectancy implies  $\beta$  - convergence.

While this model is standard in the literature it is not clear that it fits the data very well. In particular, looking at figure 6 we see that the largest gains in life expectancy did not occur in the countries that initially had the lowest life expectancy. Rather countries near the middle of the initial distribution of life expectancy seem to have done best. In addition, the appears to be much more variance in the performance of countries that initially had low life expectancy while the health gains we see in countries that had high initial life expectancy are much more tightly grouped.

Consider again Figure 9 showing the distribution of life expectancy across countries 1970 and again in 2005 using a kernel estimator. The striking feature of these plots is the twin peaks in the distribution of life expectancy. Some countries are clustered around a low level of life expectancy while others cluster around a high level of life expectancy, with very few countries being in the middle between these two clusters. Over time, the modal life expectancy in each cluster has moved to the right. However, in addition, some countries appear to have "jumped" from the low life expectancy cluster, reducing its height, to the high life expectancy cluster, increasing the size of its peak.

Figure 9 suggests a more complex model of the evolution of life expectancy is required. We propose a two regime model. In each regime there is convergence to a steady state, but these steady states may differ, being higher in regime 1 (the "high life expectancy" regime) than in regime 2 (the "mortality trap"). Countries are more likely to be the mortality trap regime if their initial life expectancy is low, but there have a chance of "jumping" to the high life expectancy regime, with a probability that depends on their initial income level.

Formally the model is:

Model 2:

 $\Delta L_i = \alpha_1 + \beta_1 L_i + \varepsilon_{1i}$  where  $\varepsilon_{1i}$  is distributed  $N(0, \sigma_1^2)$  with probability  $1 - p_i$ 

 $\Delta L_i = \alpha_2 + \beta_2 L_i + \varepsilon_{2i} \qquad \text{where } \varepsilon_{2i} \text{ is distributed } N(0, \sigma_2^2) \quad \text{with probability } p_i$ 

and 
$$p_i = CumNorm(p_0 + p_1L_i)$$

We assume that in each regime there is a linear relationship between initial life expectancy and the improvement in life expectancy. This will generate  $\beta$ -convergence within each regime. The probability of being in a particular regime depends on initial life expectancy (we assume the likelihood is a linear function of initial life expectancy, translated to a probability by the cumulative normal distribution).

We estimate model 2 by maximum likelihood. Estimation and hypothesis testing using model 2 is not straight forward since the model does not satisfy the usual regularity conditions used in statistical modeling. Our estimation methods require a grid search over possible parameter values, while hypothesis testing requires Monte Carlo methods to estimate the distribution of test statistics. The statistical problems of these types of models, and methods we can use to overcome them, are described in detail in Bloom, Canning and Sevilla (2003).

The results of our estimation of model 2 are shown in columns 2 and 3 of Table 1. We estimate two regimes each with  $\beta$ -convergence, but with different slopes. The "mortality trap" regime gives smaller improvements in life expectancy at each level of live expectancy. Figure 10 plots the two regimes. The results in table 1 show that the probability of being in the "mortality trap" regime decease as initial life expectancy rises. Countries with life expectancy above 55 in

1970 are almost certain to be in "high life expectancy" regime. However, for countries with life expectancy below 55 in 1970 there is a probability of being in the good regime and a probability of remaining in the mortality trap. A likelihood ratio test (based on bootstrapped critical values) of the two regime model against a single regime decisively rejects a single regime; the two regimes fit the date better. The two regime model also fits better than a more complex single regime models that allows for a nonlinear relationship.

We find that the data rejects the model in which all countries follow the same process in favor of the convergence club approach. Our results include a number of countries that have seen substantial declines in life expectancy since 1990 due to HIV/AIDS. However our conclusions do not depend on the presence of HIV/AIDS; we obtain similar results using data on life expectancy that exclude the effect of HIV/AIDS mortality, though in this case the performance of the "mortality trap" regime is not as bad as when we include AIDS mortality (Bloom and Canning 2007).

The twin peaks in the distribution of life expectancy in figure 10 are very similar to the twin peaks in income reported in Quah (1996). This raises the idea that development is not a smooth process, but involves a trap with low income and poor health. Some countries, however, manage to escape this trap and once they have broken free they converge quickly to the high level equilibrium. This means that we see some countries clustered around the low level trap, while others are clustered around the high level equilibrium, with only a few countries in transition between the two "clubs".

### 5. Outliers

The two regime model set out in Table 1 and shown in Figure 10 captures the overall picture of movements in life expectancy but some individual countries deviate from the predictions of the model. In Table 2 we list the countries in our dataset in order of their life expectancy in 1970 shown in column 1. In column 2 we show the actual gain in life expectancy in the country over the period 1970-2005. Column 3 shows the expected gain in the country over the period if it is in the "mortality trap" regime. Column 4 shows the expected gain in the high life expectancy regime. Column 5 gives the probability that a country is in the mortality trap regime given its life expectancy in 1970. Column 6 gives the probability that it is in the mortality trap regime given its life expectancy and the gain in life expectancy seen over the period 1970-2005. We calculate the posterior probability of the regime given the data on its performance over the period 1970-2005 using Bayes' rule. We highlight countries in green that appear to have jumped out of the mortality trap over the period, while we highlight in red those who seem to have jumped from the high life expectancy regime into the mortality trap.

Four countries seem to have jumped out of the mortality trap. Indonesia, Viet Nam, Oman, and Maldives all had low life expectancy in 1970 and based on this, the probability we assigned to them being in the mortality trap in column 5 was greater than one half. However, as we can see each of these countries experienced a rapid increase in life expectancy over the period 1970-2005. This rapid gain was in each case much closer to the rapid gain predicted by the high life expectancy regime than the mortality trap. The posterior probability of being in the mortality trap regime given this good performance, shown in column 6 of Table 2, is in each of the four cases less than one half. The countries in red, Myanmar, Kenya, Namibia, South Africa, Congo, Botswana and Zimbabwe, all had reasonably high life expectancy in 1970 and we assign them on this basis to being in the high life expectancy regime (their probability of being in the mortality trap in 1970, shown in column 5, is less than one half). However their performance over the period 1970-2005 was poor, indeed South Africa, Congo, Botswana and Zimbabwe all saw decreases in life expectancy. Given this poor performance the posterior probability they are in the mortality trap regime, shown in column 6, exceeds one half.

Considering performance relative to that predicted by the initial regime, and looking for jumps between regimes is just one way of thinking about outliers. In Figure 11 we plot actual performance against the expected change in life expectancy for each country. The expected change is the weighed average of the predicted change in each regime from columns 3 and 4 of Table 2, with the weights being the probability of the regime based initial life expectancy as shown in column 5. Figure 11 shows the expected gain declining with initial life expectancy within each regime but rising in the middle of the range of initial life expectancy due to the increasing probability of being in n the high life expectancy regime.

Table 3 lists countries together with their actual and predicted gains in life expectancy as shown in Figure 11. Column 4 in Table 11 gives the actual minus predicted gain and we focus on outliers where this difference is larger than 10 years in absolute magnitude. Countries that jump between regimes shown in table 2 tend to be near the borderline between regimes to begin with. However, outliers in absolute magnitude of their performance come from across the distribution. Bhutan, Western Sahara and Nepal appear to be in mortality trap but had very large gains in life expectancy, though not sufficient to move them out of the trap. On the other hand Indonesia, Viet Nam and Oman are all once again outliers with large gains in life expectancy relative to what we would predict given our model. Swaziland, Zambia, Lesotho, Uganda, Kenya, South Africa, Congo, Botswana and Zimbabwe all had life expectancy gains more than 10 years lower than our model predicts, which can explained by HIV/AIDS. The former Soviet Union also performed very poorly relative to our prediction, though in this case the causes are related to the collapse of employment, stress, and alcoholism (Shkolnikov et al. 2001).

#### 6. Determinants of Health

There are a number of factors that lead to health improvements. The proximal determinants are factors that affect nutrition and the disease environment, together with preventive and curative medical interventions. Improvements in nutrition strengthen the immune system and reduce susceptibility to disease. Access to clean water and sanitation can reduce the transmission of fecal contamination and the spread of infection. Preventive interventions, such as vaccination, can immunize against disease. Medical treatment can cure disease. The epidemiological transition sets out a model where countries transition from a high burden of infectious disease to a greater burden of non-infectious disease, though countries can have a dual burden with non-infectious diseases becoming prevalent while the infectious diseases have not been eliminated.

There is a debate about the relative importance of the different factors that affect health. Fogel (2004) emphasizes the historical effect of improving nutrition while Preston (1975) and Deaton (2006) put more weight technological progress and new health interventions. There is evidence of the on public health measures such as clean water and sanitation in cities (Cultler and Miller, 2005), as well as a role for medical treatment in modern populations (Cutler and McClellan, 2001). The relative importance of these mechanisms clearly varies in different times and places, and the interaction between them makes a precise accounting difficult.

An alternative to looking at these proximal determinants of health is to look at more distal determinants. We can think of health as being determined my income and education (Lleras-Muney, 2005). Income provides the means to purchase nutrition and health inputs and so leads to better health. Although there is a strong case for the direct effect of income on health due to nutrition and health interventions becoming more affordable, it may be that income is also acting as a proxy for a wider measure of socioeconomic status and development and that the causal effect is due to other mechanisms. Another possible explanation for the link between income and health at the individual level is that it is relative, and not absolute, income that matters (Lynch et al. 2000, Martikaien et al. 2002, Marmot and Wilkinson 2001, Marmot 2002). A low position in the social hierarchy may induce psychosocial stress that is linked to increased behaviors that put people at risk of ill health and to physiological reactions in the immune system that directly lead to worse health. The relative income hypothesis suggests that inequality has a direct negative effect on health but the evidence for such a direct effect is contested (Deaton, 2002, 2003)

Preston (1975) showed that, across countries, life expected was correlated with income per capita, but that the relationship changes over time. In Figure 12 we plot Preston curves for 1970 and 2005. We fit linear relationship between log income per capita and life expectancy in each year. We have put GDP per capita on a log scale to see the relationship more clearly<sup>4</sup>. There

<sup>&</sup>lt;sup>4</sup> There are a small number of countries that have very high incomes but relatively low life expectancies that do not seem to fit the usual relationship. These are oil producing countries. Note that their 1970 real GDP per capita is exceptionally high because their oil production is valued at 2005 prices (not 1970 prices).

is an upward slope to the relationship, with life expectancy being higher in countries with higher income per capita. However the relationship changes over time. For a country with a fixed level of income per capita, life expectancy in 2005 will on average be about eight years higher than in 1970. Preston showed that about three quarters of life expectancy increase can be explained by the upward movement of the curve, and about one quarter by countries getting richer and moving along the curve.

The curvature of the relationship between income and health (implicit in our use of log income on the x axis in figure 12) suggests that a policy of redistributing income from the rich to the poor will improve average health outcomes since the gains in health of those with low incomes will outweigh the losses of those with high incomes. The World Health Organization's Commission on Social Determinants of Health (2008) argues that in order to improve health inequalities countries and global institutions need to tackle the inequitable distribution of money, power, and resources in the world. The U.K government recently commissioned a report on effective evidence-based strategies for reducing health inequalities in England from 2010. The resulting Marmet Review (2010) advocates a policy of focusing on investment in childhood health and education, and reducing the gradient in living standards through a more progressive tax system. However, this policy prescription depends on the relationship being causal rather than income merely acting as a proxy for some broader notion of socio-economic status, and needs to be balanced against the negative incentive effects of redistributive taxation (Deaton, 2003)

The upward slope of the Preston curve gave birth to the idea that increased wealth leads causally to increased health. Pritchett and Summers (1996) argue that focusing on economic growth in developing countries will lead directly to reductions in infant mortality rates and improvements in life expectancy, as they see improved health as a by-product of higher income levels. The problem with this argument is that, as shown by Preston (1995), most of the health gains we have experienced have been due to improvements in health at each level of income, which is likely to be due to technological progress, i.e., using resources more effectively. Bloom and Canning (2001) found that before 1870 health in rich and poor countries was very similar, but after 1870 health improved in rich countries whereas improvements in poor countries only began after 1930. This is consistent with the view that technological advances are employed first in rich countries before eventually diffusing to poorer societies.

Relatively little work has been done that focuses directly on the contribution of technological progress to population health, though Jamison, Sandbu, and Wang (2001) identify technological progress in health and study its determinants while Cutler, Deaton, and Lleras-Muney (2006) conclude that scientific and technical advance is "the ultimate determinant of health". A further argument against focusing on income growth as a method of alleviating health burdens is that although income levels and population health are closely linked, the connection between periods of economic growth and periods of improvement in population health is very weak, suggesting that if the relationship is causal it has long and variable lags (Easterly 1999). Although rising incomes mean that society has greater resources, these resources are not always applied to health.

Preston's diagram has been taken by many to imply a causal link from wealth to health. In the years since the paper was written, however, the possibility that the link could also run in the reverse direction, from improved health to higher incomes, has been investigated. Healthier workers are more productive, and longer life spans create incentives to invest in schooling and save for retirement (Bloom and Canning, 2000). In addition, , healthier children are likely to attend school more regularly, more easily absorb knowledge while in school, and increase their cognitive ability. The health-to-wealth idea has important policy implications because it suggests that health is a cause as well as a consequence of income growth, and can be a powerful instrument of economic development and poverty reduction. Micro-level studies such as those reported by Strauss and Thomas (1998) and Schultz (2005) support this thesis, although work to estimate the size of the effect of health on wealth at the aggregate level is still ongoing (Commission on Macroeconomics and Health, 2001, Bloom Canning and Sevilla, 2004, Acemoglu and Johnson, 2006).

#### References

Acemoglou D, Johnson S, Disease and Development: The Effect of Life Expectancy on Economic Growth, National Bureau of Economic Research, 2006, Working Paper No. 12269.

Ahmad, Omar B., Alan D. Lopez, & Mie Inoue, 2000, The decline in child mortality: a reappraisal, Bull World Health Organ vol.78 no.10: 1175-1191.

Becker, G. S., Philipson, T. J., & Soares, R. R. (2005) American Economic Review 95, 277–291.

Bloom, David E. and David Canning, "Mortality Traps and the Dynamics of Health Transitions," *Proceedings of the National Academy of Sciences of the United States of America*, 2007, Vol. 104 (41), pp16044-16049.

Bloom DE, Canning D. Cumulative Causality, Economic Growth and the Demographic Transition, in *Population Matters: Demographic Change, Economic Growth, and Poverty in the* 

*Developing World*, N Birdsall, AC Kelley, and SW Sinding eds., 2001, Oxford University Press, New York: 165-197.

Bloom DE, Canning D. The Health and Wealth of Nations, Science, 2000; 287: 1207-1208.

Bloom, David E., David Canning and Jaypee Sevilla, "Geography and Poverty Traps," *Journal of Economic Growth*, 2003, Vol. 8(4), pp 355-378.

Bloom DE, Canning D, Sevilla, J. The effect of health on economic growth: A production function approach. *World Development* 2004; 32: 1–13.

Bos E, Vu MT, Stephens PW, Patience W. (1992) Policy Research Working Paper Series (World Bank, Washington, DC) No. 851.

Commission on the Measurement of Economic Performance and Social Progress (2009), *Report* of the Commission on the Measurement of Economic Performance and Social Progress, www.stiglitz-sen-fitoussi.fr/en/index.htm.

Commission on Macroeconomics and Health, *Macroeconomics and Health: Investing in Health* for Economic Development, 2001, Geneva, World Health Organization.

Commission on Social Determinants of Health, *Closing the gap in a generation: health equity through action on the social determinants of health: final report of the commission on social determinants of health*, 2008, Geneva, World Health Organization.

Commission on International Development (1969), Partners in development: report, Praeger.

Cutler DM, Miller G. The Role of Public Health Improvements in Health Advances: The Twentieth-Century United States, *Demography* 2005; 42: 1-22.

Cutler DM, McClellan M. Productivity Change in Health Care, *American Economic Review*, 2001; 91: 281-286.

Cutler David & Angus Deaton & Adriana Lleras-Muney, 2006. "The Determinants of Mortality," Journal of Economic Perspectives, American Economic Association, vol. 20(3), pages 97-120.

Daponte, Beth Osborne, Joseph B. Kadane, Lara J. Wolfson, 1997, Bayesian Demography: Projecting the Iraqi Kurdish Population, 1977-1990. *Journal of the American Statistical Association*, Vol. 92(440), pp. 1256-1267.

Deaton, Angus 2004 "Health in an Age of Globalization" Brookings Trade Forum 2004, pp. 83-130, Brookings Institution Press.

Deaton Angus, 2007, Global patterns of income and health: facts, interpretations, and policies, WIDER Annual Lecture UNU World Institute for Development Economics Research, Helsinki.

Deaton A. "The Great Escape: A Review Essay on Fogel's The Escape from Hunger and Premature Death, 1700-2100, *Journal of Economic Literature* 2006; 44: 106-114.

Deaton A. Health, Inequality, and Economic Development, *Journal of Economic Literature* 2003; 41: 113-158.

Deaton A. Policy Implications of the Gradient of Health and Wealth" *Health Affairs* 2002; 21: 13-30.

Easterly, W. (1999), "Life during Growth", *Journal of Economic Growth, Vol.* 4, No. 3, pp. 239-76.

Edwards, Ryan D., The Cost of Uncertain Life Span (June 2008). NBER Working Paper Series, Vol. w14093.

Fogel RW. *The Escape from Hunger and Premature Death, 1700-2100: Europe, America, and the Third World.* Cambridge: Cambridge University Press, 2004.

Fries, J.F., 2003, Measuring and Monitoring Success in Compressing Morbidity, *Annals of Internal Medicine*, 139:455-459.

Girosi, Federico and Gary King, Demographic Forecasting, Princeton University Press, 2008.

Hill K (2003) Adult Mortality in the Developing World: What We Know and How We Know It, Population Division, Department of Economic and Social Affairs, United Nations, New York.

Hobijn B, Franses PH. Are Living Standards Converging? *Structural Change & Economic Dynamics* 2001; 12: 171-200.

Jamison, Dean T., Martin Sandbu and Jia Wang, 2001, "Cross-country variation in mortality decline, 1962–87: the role of country specific technical progress," Commission on Macroeconomics and Health, Working Paper WG1, No 4.

Kaplow, Louis, 2007, "Discounting Dollars, Discounting Lives: Intergenerational Distributive Justice and Efficiency," *The University of Chicago Law Review*, Vol. 74, No. 1, pp. 79-118.

Lleras-Muney A. The Relationship Between Education and Adult Mortality in the United States, *Review of Economic Studies* 2005; 72: 189-221.

Lynch J, Davey Smith G, Kaplan GA, House JS. Income inequality and mortality: importance to health of individual income, psychosocial environment, or material conditions, *British Medical Journal* 2000; 320: 1200–04.

Lopez AD, Ahmad OB, Guillot M, Ferguson BD, Salomon JA, **Murray CJL**, Hill KH. Life tables for 191 countries for 2000: data, methods, results. In: Murray CJL, Evans DB, eds. *Health* 

systems performance assessment: debates, methods and empiricism. Geneva, World Health Organization, 2003:335-353.

Mathers CD, Salomon JA, Murray CJL, Lopez AD. Alternative summary measures of average population health. In: Murray CJL, Evans DB, eds. *Health systems performance assessment: debates, methods and empiricism.* Geneva, World Health Organization, 2003:319-334.

McMichael, AJ, McKee M, Shkolnikov V, Valkonen T. Mortality trends and setbacks: global convergence or divergence? *Lancet* 2004; 363: 1155-59.

Martikainen P, Bartley M, Lahelma E. Psychosocial Determinants of Health in Social Epidemiology, *International Journal of Epidemiology* 2002; 31:1091–93.

Marmot M, Wilkinson RG. Psychosocial and material pathways in the relation between income and health: a response to Lynch et al. *British Medical Journal* 2001; 322: 1233–36.

Marmot M. The Influence of Income on Health: Views of an Epidemiologist, *Health Affairs* 2002; 21: 31-46.

Marmet Review (2010), Strategic Review of Health Inequalities in England post-2010, the Marmot Review

Molina, George Gray and Mark Purser, 2010, Human Development Trends Since 1970.

Neumayer E. Beyond Income: Convergence in Living Standards, Big Time. *Structural Change* & *Economic Dynamics* 2003; 14: 275-96.

Preston, S. (1975), "The Changing Relation between Mortality and Level of Economic Development", *Population Studies*, Vol. 29, No. 2, pp. 231-248.

Pritchett L, Summers LH. Wealthier is Healthier. *Journal of Human Resources* 1996; 31: 841-868.

Quah, Danny T, 1996."Twin Peaks: Growth and Convergence in Models of Distribution Dynamics," Economic Journal, Vol. 106(437), 1045-55.

Sab R, Smith, SC. Human Capital Convergence: A Joint Estimation Approach. *IMF Staff Papers* 2002; 49: 200-211.

Schultz TP. Productive Benefits of Health: Evidence from Low Income Countries, in *Health and Economic Growth: Findings and Policy Implications*, G Lopez-Casasnovas, B Riveras and L Currais eds., 2005, MIT Press, Cambridge, MA.

Shkolnikov, Vladimir, Martin McKee, David A Leon, 2001, Changes in life expectancy in Russia in the mid-1990s, *The Lancet*, Volume 357, Issue 9260, Pages 917-921.

Strauss J, Thomas D, Health, Nutrition, and Economic Development," *Journal of Economic Literature* 1998; 36: 766-817.

United Nations Development Program (1991), *Human Development Report 1990*, Oxford University Press, New York.

Vaupel, J. W., 1986, "How Change in Age-specific Mortality Affects Life Expectancy" *Population Studies*, Volume 40(1): 147 – 157.

Viscusi, W.K., and J.E. Aldy, 2003, The Value of a Statistical Life: A Critical Review of Market Estimates from Around the World, *The Journal of Risk and Uncertainty* 27: 5–76.

White KM. Longevity Advances in High-Income Countries, 1955-96. *Population and Development Review* 2002; 28: 59-76.

World Health Organization (2004), World Health Report 2004, Geneva.

World Bank (2001), World Development Report 2000/01- Attacking Poverty, New York.

## Table 1

## Models of Conditional Convergence in Life Expectancy

	M. 1.11	M- 1-12	
	Model 1	Model 2	
	Linear	Two Regimes	
		Regime 1	Regime 2
Constant	20.152	43.171	45.492
	(8.89)	(4.08)	(14.92)
Initial Life	-0.167	-0.765	-0.544
Expectancy 1970	(4.85)	(3.16)	(11.07)
Standard Error of	5.883	6.338	3.083
the residuals			
Probability of		10.16	
Regime 2:		(3.08)	
Intercept		0.000	
Probability of		-0.203	
Regime 2: effect		(3.18)	
of initial life			
expectancy			
Number of	174	174	
Observations	1/4	1/4	
	-554.24	-507.98	
Log Likelihood	-334.24	-307.98	
L		1	

Dependent variable, change in life expectancy 1970-2005.

Heteroskedastic consistent t statistics in parentheses

## Table 2Life Expected Gains and Regime Predictions 1970-2005

Life Expected Gains a	Life expectancy 1970	Gain i	nRegime expected	1 Regime expected gain	of regime 1 given 1970 life	given gain 1970-2005
Afghanistan	35.0	7.9	16.4	26.4	expectancy 1.00	1.00
Sierra Leone	36.0	10.4	15.7	25.9	1.00	1.00
Angola	37.0	8.5	14.9	25.4	1.00	1.00
Guinea-Bissau	37.2	9.8	14.7	25.3	1.00	1.00
Mali	37.5	9.8	14.5	25.1	0.99	1.00
Niger	38.1	11.5	14.0	24.7	0.99	1.00
Yemen	38.2	23.3	13.9	24.7	0.99	0.98
Guinea	39.2	17.1	13.2	24.2	0.99	1.00
Mozambique	39.2	8.4	13.2	24.1	0.99	1.00
Timor-Leste	39.5	20.2	12.9	24.0	0.98	0.99
Equatorial Guinea	39.8	9.5	12.8	23.9	0.98	1.00
Somalia	40.1	9.5	12.5	23.7	0.98	1.00
Nigeria	40.4	6.9	12.3	23.5	0.98	1.00
Gambia	40.6	14.6	12.1	23.4	0.97	1.00
Malawi	40.6	10.5	12.1	23.4	0.97	1.00
Bhutan	40.6	24.2	12.1	23.4	0.97	0.86
Burkina Faso	41.5	10.6	11.4	22.9	0.96	1.00
Central Africa Republic	n 42.0	4.2	11.1	22.7	0.95	1.00
Western Sahara	42.0	22.9	11.0	22.6	0.95	0.77
Senegal	42.6	12.3	10.6	22.3	0.94	1.00

	Life expectancy 1970			1 Regime expected gain	of regime 1 given 1970 life	given gain 1970-2005
Nepal	42.6	22.6	10.6	22.3	expectancy 0.94	0.71
thiopia	42.9	10.8	10.3	22.1	0.93	1.00
Djibouti	43.2	11.2	10.1	22.0	0.92	1.00
Papua New Guinea	43.3	16.7	10.1	21.9	0.92	0.96
Eritrea	43.3	15.1	10.0	21.9	0.92	0.99
Cambodia	43.6	15.8	9.8	21.8	0.91	0.98
Burundi	43.8	5.4	9.7	21.7	0.90	1.00
Congo (DR)	43.8	3.8	9.6	21.6	0.90	1.00
Madagascar	43.8	15.1	9.6	21.6	0.90	0.98
Bangladesh	44.0	20.6	9.5	21.5	0.89	0.65
Rwanda	44.4	4.0	9.2	21.3	0.88	1.00
Liberia	44.4	12.6	9.2	21.3	0.88	1.00
Chad	44.6	3.9	9.0	21.2	0.87	1.00
Benin	45.5	14.7	8.4	20.8	0.82	0.95
Bolivia	45.8	18.9	8.2	20.6	0.81	0.54
Cameroon	45.9	4.7	8.0	20.5	0.80	1.00
Lao PDR	46.0	17.6	8.0	20.4	0.80	0.66
Sudan	46.4	10.9	7.7	20.3	0.77	1.00
Gabon	46.7	12.8	7.5	20.1	0.75	1.00
Tanzania	46.7	7.0	7.5	20.1	0.75	0.97
Côte d'Ivoire	47.0	9.0	7.2	19.9	0.73	1.00

	Life expectancy 1970			1 Regime expected gain	of regime 1 given 1970 life	given gain 1970-2005
Haiti	47.2	13.2	7.1	19.8	expectancy 0.72	0.94
Indonesia	47.6	22.1	6.8	19.6	0.69	0.14
Mauritania	47.7	8.8	6.7	19.6	0.69	1.00
Comoros	47.7	16.4	6.7	19.5	0.69	0.54
Swaziland	48.0	-3.0	6.4	19.4	0.66	1.00
India	48.8	13.9	5.8	18.9	0.60	0.73
Viet Nam	48.8	25.0	5.8	18.9	0.60	0.10
Ghana	48.9	7.7	5.8	18.9	0.60	1.00
Zambia	49.0	-6.1	5.7	18.8	0.59	1.00
Lesotho	49.0	-4.2	5.7	18.8	0.59	1.00
Togo	49.3	12.1	5.5	18.7	0.56	0.88
Oman	49.5	25.5	5.3	18.6	0.55	0.08
Uganda	49.8	0.4	5.0	18.4	0.52	1.00
Maldives	49.9	20.1	5.0	18.4	0.52	0.07
Egypt	50.5	19.1	4.6	18.0	0.47	0.06
Libyan Ara		22.0	2.0	17.6	0.40	0.02
Jamahiriya	51.3	22.0	3.9	17.6	0.40	0.03
Myanmar	51.5	9.1	3.8	17.5	0.39	0.95
Morocco	51.6	18.9	3.7	17.4	0.38	0.04
Saudi Arabia	51.8	20.4	3.5	17.3	0.36	0.03
Guatemala	52.1	17.6	3.4	17.2	0.34	0.04
Kenya	52.2	0.3	3.3	17.1	0.33	1.00

	Life expectancy 1970	Gain Life Expectan 1970-200		1 Regime expected gain	2 Probability of regime 1 given 1970 life expectancy	regime 1 given gain 1970-2005
Honduras	52.4	19.1	3.1	17.0	0.32	0.02
Vanuatu	52.5	16.8	3.0	16.9	0.31	0.04
Namibia	52.6	6.1	3.0	16.9	0.31	0.99
Mongolia	52.6	12.9	2.9	16.9	0.31	0.23
South Africa	52.8	-1.0	2.8	16.8	0.29	1.00
Algeria	52.9	18.8	2.7	16.7	0.28	0.02
Peru	53.5	19.0	2.3	16.4	0.24	0.01
Nicaragua	53.6	18.3	2.1	16.3	0.24	0.01
Tunisia	53.7	19.8	2.1	16.3	0.23	0.01
Iran (IR)	53.9	16.7	1.9	16.2	0.22	0.02
Jordan	54.0	17.9	1.9	16.1	0.21	0.01
Occupied Palestinian		10.0	1.0	1 < 1	0.01	0.01
Territories	54.0	18.9	1.8	16.1	0.21	0.01
Pakistan	54.2	11.3	1.7	16.0	0.20	0.21
Solomon Islands	54.2	10.6	1.7	16.0	0.20	0.31
Congo	54.4	-1.1	1.5	15.9	0.19	1.00
Botswana	54.6	-3.6	1.4	15.8	0.18	1.00
Zimbabwe	54.9	-13.2	1.2	15.6	0.16	1.00
Samoa	54.9	15.9	1.2	15.6	0.16	0.01
Syrian Arab Republic	55.4	18.2	0.8	15.3	0.14	0.01
Sao Tome and Principe	55.5	9.4	0.7	15.3	0.14	0.28
Turkey	55.7	15.7	0.6	15.2	0.13	0.01

	Life expectancy 1970			1 Regime expected gain	of regime 1	given gain 1970-2005
Cape Verde	56.5	14.0	0.0	14.8	0.10	0.01
El Salvador	56.6	14.2	-0.1	14.7	0.09	0.01
Philippines	57.2	13.8	-0.6	14.4	0.07	0.01
Ecuador	57.8	16.9	-1.0	14.1	0.06	0.00
Iraq	58.0	10.5	-1.2	13.9	0.05	0.02
Dominican Republic	58.4	13.7	-1.5	13.7	0.05	0.00
Brazil	58.6	13.1	-1.6	13.6	0.04	0.00
Korea (Republic of)	59.2	19.4	-2.1	13.3	0.03	0.00
Thailand	59.4	9.0	-2.3	13.2	0.03	0.02
Fiji	59.6	8.7	-2.4	13.1	0.03	0.02
Guyana	59.7	5.8	-2.5	13.0	0.03	0.15
French Polynesia	60.1	13.6	-2.8	12.8	0.02	0.00
Qatar	60.5	14.5	-3.1	12.6	0.02	0.00
New Caledonia	60.5	15.2	-3.1	12.6	0.02	0.00
United Arab Emirates	60.5	16.5	-3.1	12.6	0.02	0.00
St. Vincent- Grenadine	s 60.6	10.4	-3.2	12.5	0.02	0.00
Colombia	60.9	11.4	-3.4	12.4	0.01	0.00
Malaysia	61.3	12.4	-3.7	12.1	0.01	0.00
Mexico	61.4	14.1	-3.8	12.1	0.01	0.00
Micronesia	61.6	6.4	-4.0	12.0	0.01	0.01
Bahrain	61.7	13.6	-4.0	11.9	0.01	0.00

	Life expectancy 1970		. 0	1 Regime expected gain	2Probability of regime 1 given 1970 life expectancy	regime 1 given gain 1970-2005
China	62.0	10.6	-4.2	11.8	0.01	0.00
Korea (DPR)	62.0	4.8	-4.2	11.8	0.01	0.04
Chile	62.0	16.2	-4.3	11.8	0.01	0.00
Mauritius	62.2	9.8	-4.4	11.7	0.01	0.00
Réunion	62.4	13.7	-4.6	11.5	0.01	0.00
Sri Lanka	62.6	11.1	-4.7	11.5	0.01	0.00
Suriname	63.3	5.1	-5.3	11.0	0.00	0.01
Saint Lucia	63.9	9.2	-5.7	10.7	0.00	0.00
Grenada	64.3	10.6	-6.1	10.5	0.00	0.00
Lebanon	64.7	6.8	-6.3	10.3	0.00	0.00
Tonga	65.0	6.5	-6.5	10.2	0.00	0.00
Venezuela	65.0	8.3	-6.6	10.1	0.00	0.00
French Guiana	65.2	10.3	-6.7	10.0	0.00	0.00
Panama	65.4	9.8	-6.8	9.9	0.00	0.00
Paraguay	65.4	5.9	-6.9	9.9	0.00	0.00
Guam	65.6	9.5	-7.0	9.8	0.00	0.00
Trinidad and Tobago	65.6	3.1	-7.0	9.8	0.00	0.00
Macao, China (SAR)	65.8	14.2	-7.2	9.7	0.00	0.00
Bahamas	66.2	6.2	-7.5	9.5	0.00	0.00
Kuwait	66.4	10.9	-7.6	9.4	0.00	0.00
Belize	66.4	9.0	-7.6	9.4	0.00	0.00

	Life expectancy 1970			1 Regime expected gain	2 Probability of regime 1 given 1970 life expectancy	regime 1 given gain 1970-2005
Argentina	66.6	8.2	-7.8	9.3	0.00	0.00
Brunei Darussalam	66.7	10.1	-7.8	9.2	0.00	0.00
Guadeloupe	66.7	12.0	-7.9	9.2	0.00	0.00
Costa Rica	66.8	11.6	-8.0	9.1	0.00	0.00
Albania	67.0	9.2	-8.1	9.1	0.00	0.00
Portugal	67.1	11.1	-8.1	9.0	0.00	0.00
US Virgin Islands	67.7	10.8	-8.6	8.7	0.00	0.00
Yugoslavia	67.9	6.7	-8.7	8.6	0.00	0.00
Martinique	67.9	11.3	-8.8	8.5	0.00	0.00
Romania	68.0	4.0	-8.9	8.5	0.00	0.00
Jamaica	68.3	3.0	-9.1	8.3	0.00	0.00
Former Soviet Union	68.5	-1.9	-9.2	8.2	0.00	0.01
Barbados	68.5	8.0	-9.2	8.2	0.00	0.00
Uruguay	68.7	7.0	-9.4	8.1	0.00	0.00
Singapore	68.8	10.8	-9.5	8.1	0.00	0.00
Aruba	69.2	5.1	-9.7	7.9	0.00	0.00
Hungary	69.3	3.6	-9.9	7.8	0.00	0.00
Netherlands Antilles	69.4	6.4	-9.9	7.8	0.00	0.00
Cuba	69.9	8.1	-10.3	7.5	0.00	0.00
Malta	70.0	9.3	-10.4	7.4	0.00	0.00
Czechoslovakia	70.1	5.3	-10.4	7.4	0.00	0.00

	Life expectancy 1970	Gain Life Expectan 1970-200		1 Regime expected gain	of regime 1	given gain 1970-2005
Finland	70.1	8.9	-10.5	7.4	0.00	0.00
Austria	70.1	9.3	-10.5	7.3	0.00	0.00
Luxembourg	70.2	8.7	-10.5	7.3	0.00	0.00
Poland	70.2	4.9	-10.6	7.3	0.00	0.00
Cyprus	70.8	8.6	-11.0	7.0	0.00	0.00
Germany	70.8	8.5	-11.0	7.0	0.00	0.00
United States	70.8	7.9	-11.0	7.0	0.00	0.00
Bulgaria	71.1	1.6	-11.2	6.8	0.00	0.00
Hong Kong, Chin (SAR)	a 71.1	10.9	-11.2	6.8	0.00	0.00
Belgium	71.1	7.8	-11.2	6.8	0.00	0.00
Australia	71.1	9.9	-11.3	6.8	0.00	0.00
Ireland	71.2	7.7	-11.3	6.8	0.00	0.00
Israel	71.2	9.1	-11.3	6.8	0.00	0.00
New Zealand	71.4	8.4	-11.5	6.6	0.00	0.00
Italy	71.5	9.3	-11.5	6.6	0.00	0.00
Puerto Rico	71.7	6.8	-11.6	6.5	0.00	0.00
United Kingdom	71.7	7.3	-11.7	6.5	0.00	0.00
Greece	71.7	7.0	-11.7	6.5	0.00	0.00
France	71.8	8.6	-11.8	6.4	0.00	0.00
Japan	72.2	10.2	-12.1	6.2	0.00	0.00
Spain	72.2	8.1	-12.1	6.2	0.00	0.00

	Life expectancy 1970		U	1 Regime expected gain	of regime 1 given 1970 life	given gain 1970-2005
Canada	72.5	7.7	-12.3	6.0	expectancy 0.00	0.00
Switzerland	72.9	8.4	-12.6	5.8	0.00	0.00
Denmark	73.2	4.6	-12.9	5.6	0.00	0.00
Netherlands	73.7	5.6	-13.2	5.4	0.00	0.00
Iceland	73.7	7.8	-13.2	5.4	0.00	0.00
Norway	74.1	5.9	-13.5	5.2	0.00	0.00
Sweden	74.4	6.1	-13.8	5.0	0.00	0.00

Table 3	
Outliers based on Life Expected Gains and Expected Gain 1970-2005	

Outliers based on Life Expected Gains	Life Expectancy 1970	Gain in	Predicted gain:	Actual minus Predicted Gain
Afghanistan	35.0	7.9	16.4	-8.6
Sierra Leone	36.0	10.4	15.7	-5.3
Angola	37.0	8.5	14.9	-6.4
Guinea-Bissau	37.2	9.8	14.7	-5.0
Mali	37.5	9.8	14.6	-4.7
Niger	38.1	11.5	14.1	-2.5
Yemen	38.2	23.3	14.0	9.3
Guinea	39.2	17.1	13.3	3.7
Mozambique	39.2	8.4	13.3	-4.9
Timor-Leste	39.5	20.2	13.1	7.1
Equatorial Guinea	39.8	9.5	13.0	-3.5
Somalia	40.1	9.5	12.7	-3.2
Nigeria	40.4	6.9	12.6	-5.7
Gambia	40.6	14.6	12.4	2.2
Malawi	40.6	10.5	12.4	-1.9
Bhutan	40.6	24.2	12.4	11.8
Burkina Faso	41.5	10.6	11.9	-1.3
Central African Republic	42.0	4.2	11.7	-7.5
Western Sahara	42.0	22.9	11.6	11.3
Senegal	42.6	12.3	11.4	1.0
Nepal	42.6	22.6	11.4	11.3

	Life Expectancy 1970	Gain in Life Expectancy 1970-2005	Predicted gain: two regim model	Actual minus nePredicted Gain
Ethiopia	42.9	1970-2003 10.8	11.2	-0.3
Djibouti	43.2	11.2	11.1	0.2
Papua New Guinea	43.3	16.7	11.1	5.6
Eritrea	43.3	15.1	11.0	4.1
Cambodia	43.6	15.8	10.9	4.9
Burundi	43.8	5.4	10.9	-5.5
Congo (Democratic Republic of the)	43.8	3.8	10.8	-7.0
Madagascar	43.8	15.1	10.8	4.3
Bangladesh	44.0	20.6	10.8	9.8
Rwanda	44.4	4.0	10.7	-6.7
Liberia	44.4	12.6	10.7	1.9
Chad	44.6	3.9	10.6	-6.7
Benin	45.5	14.7	10.6	4.1
Bolivia	45.8	18.9	10.6	8.3
Cameroon	45.9	4.7	10.5	-5.8
Lao People's Democratic Republic	46.0	17.6	10.5	7.1
Sudan	46.4	10.9	10.6	0.3
Gabon	46.7	12.8	10.6	2.2
Tanzania (United Republic of)	46.7	7.0	10.6	-3.6
Côte d'Ivoire	47.0	9.0	10.6	-1.6
Haiti	47.2	13.2	10.6	2.6
Indonesia	47.6	22.1	10.7	11.4

	Life Expectancy 1970	Gain in Life Expectancy 1970-2005	Predicted gain: two regim model	Actual minus nePredicted Gain
Mauritania	47.7	8.8	10.7	-2.0
Comoros	47.7	16.4	10.7	5.6
Swaziland	48.0	-3.0	10.8	-13.8
India	48.8	13.9	11.0	2.9
Viet Nam	48.8	25.0	11.0	14.0
Ghana	48.9	7.7	11.1	-3.5
Zambia	49.0	-6.1	11.1	-17.2
Lesotho	49.0	-4.2	11.1	-15.3
Togo	49.3	12.1	11.3	0.8
Oman	49.5	25.5	11.3	14.2
Uganda	49.8	0.4	11.4	-11.0
Maldives	49.9	20.1	11.5	8.6
Egypt	50.5	19.1	11.7	7.3
Libyan Arab Jamahiriya	51.3	22.0	12.1	9.9
Myanmar	51.5	9.1	12.2	-3.1
Morocco	51.6	18.9	12.2	6.7
Saudi Arabia	51.8	20.4	12.3	8.1
Guatemala	52.1	17.6	12.5	5.1
Kenya	52.2	0.3	12.5	-12.2
Honduras	52.4	19.1	12.6	6.5
Vanuatu	52.5	16.8	12.6	4.2
Namibia	52.6	6.1	12.7	-6.6

	Life Expectancy 1970	Gain in Life Expectancy 1970-2005	Predicted gain: two regin model	Actual minus nePredicted Gain
Mongolia	52.6	12.9	12.6	0.3
South Africa	52.8	-1.0	12.7	-13.7
Algeria	52.9	18.8	12.7	6.0
Peru	53.5	19.0	13.0	6.0
Nicaragua	53.6	18.3	12.9	5.4
Tunisia	53.7	19.8	13.0	6.8
Iran (Islamic Republic of)	53.9	16.7	13.1	3.7
Jordan	54.0	17.9	13.1	4.9
Occupied Palestinian Territories	54.0	18.9	13.0	5.9
Pakistan	54.2	11.3	13.1	-1.8
Solomon Islands	54.2	10.6	13.1	-2.5
Congo	54.4	-1.1	13.2	-14.3
Botswana	54.6	-3.6	13.2	-16.8
Zimbabwe	54.9	-13.2	13.2	-26.4
Samoa	54.9	15.9	13.2	2.7
Syrian Arab Republic	55.4	18.2	13.3	5.0
Sao Tome and Principe	55.5	9.4	13.3	-3.9
Turkey	55.7	15.7	13.3	2.4
Cape Verde	56.5	14.0	13.4	0.7
El Salvador	56.6	14.2	13.3	0.8
Philippines	57.2	13.8	13.3	0.5
Ecuador	57.8	16.9	13.2	3.7

	Life Expectancy 1970	Gain in Life Expectancy 1970-2005	Predicted gain: two regim model	Actual minus nePredicted Gain
Iraq	58.0	10.5	13.1	-2.6
Dominican Republic	58.4	13.7	13.0	0.7
Brazil	58.6	13.1	13.0	0.1
Korea (Republic of)	59.2	19.4	12.8	6.6
Thailand	59.4	9.0	12.7	-3.7
Fiji	59.6	8.7	12.7	-4.0
Guyana	59.7	5.8	12.6	-6.8
French Polynesia	60.1	13.6	12.5	1.1
Qatar	60.5	14.5	12.3	2.2
New Caledonia	60.5	15.2	12.3	2.8
United Arab Emirates	60.5	16.5	12.3	4.2
Saint Vincent and the Grenadines	60.6	10.4	12.2	-1.8
Colombia	60.9	11.4	12.2	-0.8
Malaysia	61.3	12.4	11.9	0.4
Mexico	61.4	14.1	11.9	2.2
Micronesia (Federated States of)	61.6	6.4	11.8	-5.4
Bahrain	61.7	13.6	11.8	1.8
China	62.0	10.6	11.7	-1.1
Korea (Democratic People's Rep. of)	62.0	4.8	11.7	-6.8
Chile	62.0	16.2	11.7	4.5
Mauritius	62.2	9.8	11.6	-1.7
Réunion	62.4	13.7	11.4	2.3

	Life Expectancy 1970	Gain in Life Expectancy 1970-2005	Predicted gain: two regim model	Actual minus nePredicted Gain
Sri Lanka	62.6	11.1	11.4	-0.3
Suriname	63.3	5.1	10.9	-5.8
Saint Lucia	63.9	9.2	10.7	-1.4
Grenada	64.3	10.6	10.5	0.1
Lebanon	64.7	6.8	10.3	-3.5
Tonga	65.0	6.5	10.2	-3.7
Venezuela (Bolivarian Republic of)	65.0	8.3	10.1	-1.8
French Guiana	65.2	10.3	10.0	0.3
Panama	65.4	9.8	9.9	-0.1
Paraguay	65.4	5.9	9.9	-4.0
Guam	65.6	9.5	9.8	-0.3
Trinidad and Tobago	65.6	3.1	9.8	-6.7
Macao, China (SAR)	65.8	14.2	9.7	4.5
Bahamas	66.2	6.2	9.5	-3.3
Kuwait	66.4	10.9	9.4	1.5
Belize	66.4	9.0	9.4	-0.4
Argentina	66.6	8.2	9.3	-1.1
Brunei Darussalam	66.7	10.1	9.2	0.9
Guadeloupe	66.7	12.0	9.2	2.8
Costa Rica	66.8	11.6	9.1	2.5
Albania	67.0	9.2	9.1	0.1
Portugal	67.1	11.1	9.0	2.1

	Life Expectancy 1970	Gain in Life Expectancy 1970-2005	Predicted gain: two regim model	Actual minus Predicted Gain
United States Virgin Islands	67.7	10.8	8.7	2.1
Yugoslavia	67.9	6.7	8.6	-1.9
Martinique	67.9	11.3	8.5	2.8
Romania	68.0	4.0	8.5	-4.5
Jamaica	68.3	3.0	8.3	-5.3
Former Soviet Union	68.5	-1.9	8.2	-10.0
Barbados	68.5	8.0	8.2	-0.2
Uruguay	68.7	7.0	8.1	-1.1
Singapore	68.8	10.8	8.1	2.7
Aruba	69.2	5.1	7.9	-2.8
Hungary	69.3	3.6	7.8	-4.2
Netherlands Antilles	69.4	6.4	7.8	-1.4
Cuba	69.9	8.1	7.5	0.6
Malta	70.0	9.3	7.4	1.9
Czechoslovakia	70.1	5.3	7.4	-2.1
Finland	70.1	8.9	7.4	1.5
Austria	70.1	9.3	7.3	2.0
Luxembourg	70.2	8.7	7.3	1.4
Poland	70.2	4.9	7.3	-2.4
Cyprus	70.8	8.6	7.0	1.6
Germany	70.8	8.5	7.0	1.5
United States	70.8	7.9	7.0	0.9

Life Expectancy 1970			Actual minus nePredicted Gain
71.1	1.6	6.8	-5.2
71.1	10.9	6.8	4.1
71.1	7.8	6.8	1.0
71.1	9.9	6.8	3.1
71.2	7.7	6.8	0.9
71.2	9.1	6.8	2.3
71.4	8.4	6.6	1.8
71.5	9.3	6.6	2.7
71.7	6.8	6.5	0.3
71.7	7.3	6.5	0.8
71.7	7.0	6.5	0.5
71.8	8.6	6.4	2.2
72.2	10.2	6.2	4.0
72.2	8.1	6.2	1.9
72.5	7.7	6.0	1.7
72.9	8.4	5.8	2.6
73.2	4.6	5.6	-1.0
73.7	5.6	5.4	0.2
73.7	7.8	5.4	2.4
74.1	5.9	5.2	0.7
74.4	6.1	5.0	1.1
	Expectancy 1970 71.1 71.1 71.1 71.1 71.2 71.2 71.2 71.4 71.5 71.7 71.7 71.7 71.7 71.7 71.7 71.7	Expectancy 1970Life Expectancy 1970-200571.110.971.110.971.17.871.19.971.27.771.29.171.48.471.59.371.76.871.77.371.77.071.88.672.210.272.28.172.57.772.98.473.75.673.75.874.15.9	Expectancy 1970Life Expectancy 1970-2005gain: wo regin model71.11.66.871.110.96.871.17.86.871.19.96.871.27.76.871.29.16.871.48.46.671.76.86.571.77.36.571.77.06.571.88.66.472.210.26.272.57.76.072.98.45.873.75.65.473.77.85.4





















