

Probability of death before age 70: progress as years behind or ahead of the global average trend

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Significance

This study underscores persistent inequality in living standards and access to health enhancing technologies, which in turn impact long-run declines in the probability of premature death (PPD)—defined here as probability of dying before age 70 years. For example, sub-Saharan Africa was 44 years behind the global average PPD and 100 years behind the best performing country each year—the frontier. This suggests a combination of health-enhancing technologies and living standards that were last observed for the world average in 1975 and in 1919 in the frontier. When considering PPD expected based on economic development, the United States had per capita GDP reflecting health-enhancing technologies and living standards to the same extent as in the average country 45 years earlier.

ABSTRACT

Advances in health technology and living standards have reduced mortality worldwide but geographic disparities remain. This study examined uneven decline in probability of premature death (PPD)—before age 70 years—across regions, benchmarking progress as years behind or ahead of 1) global average PPD and 2) expected PPD given level of economic development, and 3) years behind PPD in the best performing country each year—the frontier. Global PPD fell from 67% to 32% 1950–2019. Sub-Saharan Africa, Central Asia, and India were behind the global PPD, both in 2000 and 2019. Sub-Saharan Africa’s PPD in 2019 was 52%, corresponding to the 1975 global PPD, suggesting that sub-Saharan Africa had a combination of health-enhancing technologies and living standards observed for the world average 44 years earlier. Sub-Saharan Africa was 100 years behind the frontier PPD, suggesting its 2019 PPD was already achievable in 1919 among those with access to the best available health-enhancing technology and living standards. India converged somewhat towards the global PPD, being 20 years behind in 2000 and 13 years behind in 2019. The North Atlantic was the furthest ahead, 44 years, achieving the 2019 global PPD in 1975. Given GDP, in 2019, the United States had a PPD expected in 1974, which suggests that per capita GDP reflected health-enhancing technologies and living standards to the same extent as in the average country 45 years earlier. International cooperation should ensure that technological and medical advancements lead to universal health benefits that are rapidly and fairly disseminated.

Introduction

Life expectancy has been on an upward trajectory for over two centuries, thanks to advances in medical science, public health, and living standards.^{1,2} However, progress has been uneven across regions leading to stark disparities in mortality. For example, in 2019, the probability of premature death (PPD)—the chance of dying before age 70 years—was 15% in Western Europe and Canada, 22% in the United States, 36% in India, and 52% in sub-Saharan Africa.³

Development is by its nature a long-run process and gaps in important outcomes such as PPD across countries highlight unequal improvements of living standards and access to life-extending health technologies.⁴⁻⁶ This study examined the uneven decline in the PPD across geographic regions. Our comparative analysis shows how many years behind or ahead of global PPD a region was in 2000 and 2019. For instance, if a region had a PPD in 2019 that was the same as the global PPD in 1999, we considered that region to be 20 years behind the global progress in PPD. Conversely, if a region had a PPD in 1999 that was equivalent to the global PPD of 2019, it was considered 20 years ahead. We show results for both 2000 and 2019 to explore whether regions are converging in terms of PPD: that is, whether regions that were behind in 2000 have been catching up and were fewer years behind in 2019. We also show years behind the “frontier” PPD—PPD in the country with the lowest PPD each year.

Economic growth and life expectancy improvements are both part of a broader development process with many shared explanatory factors. Causal links between economic growth and health have also been suggested, running in both directions: Improved health can increase growth, since healthier populations are more productive and have greater incentives to both save and invest in their human capital (as they expect to live longer).^{2,7} Economic growth can also improve health, for example, by improving living standards, allowing building and

maintenance of important public health infrastructure, and increasing spending on medical treatments.² Therefore, we also assessed the PPD performance relative to the expected level of progress given economic development. We did this by integrating Preston curves—which show the cross-sectional relationship between PPD and aggregate income⁸—into our examination. Ultimately, health enhancing activities will be bounded by income, but countries at the same level of economic development can still achieve vastly different health outcomes due to contextual factors, such as prioritization of health spending, sub-national inequalities, and cultural and environmental factors.

Data and Methods

Data sources

Mortality probabilities for single year age intervals were obtained for 236 countries and territories between 1950–2023 from the United Nations World Population Prospects (UN WPP) 2024 life tables.⁹ These mortality probabilities were used to calculate the probability of dying before age 70 years (${}_{70}q_0$), or PPD. We obtained real per capita GDP (in 2011 international \$) and total population, available for 169 countries from the 2023 version of the Maddison Project database.¹¹

We follow the regional classification used in the third report of *The Lancet* Commission on Investing in Health: Central Asia, Central & Eastern Europe, Middle East & North Africa, sub-Saharan Africa, Latin America & the Caribbean, Western Pacific & Southeast Asia (excluding China) and the North Atlantic (Western Europe and Canada: see appendix table S1 for details). We also considered the three most populous countries separately: China, India, and the United States (for consciousness, we will refer to these countries as regions in

the text). We also show results for the 30 most populous countries in 2019 based on UN WPP 2024 population estimates.¹⁰

Estimating years behind or ahead of the global average PPD

We restricted our main analyses to years before 2020 to avoid (presumably) temporary distortions due to the COVID-19 pandemic. Our main benchmark was the global PPD from 1950–2019. Since the life extending technologies generally only advance, we considered increases in PPD across years in this period to be temporary setbacks. Therefore, we removed increases in global PPD across years (which happened in 1959, 1960, and 1965): therefore, the benchmark is the lowest global average PPD ever observed for each year.

We determined how many years behind or ahead a region was compared with the global PPD. As an example, consider India in 2019. Since India had a PPD above the global PPD it was behind the global PPD benchmark (table S2). We then identified the most recent year that the global PPD was greater than India's 2019 PPD. That year was 2006 (figure 1). Therefore, in 2019, India was 13 years behind the global PPD. On the other hand, China was ahead of the benchmark since it had a PPD below the global PPD in 2019. We identified the most recent year that China's PPD was above the global 2019 PPD. That year was 1997, so, in 2019, China was 22 years ahead of the global PPD. We do the same for each region in 2000, which shows whether regions and countries that were behind are catching up.

As a supplementary analysis, we compare years behind global average PPD in 2019 to that of 2023 to assess the impact of the COVID-19 pandemic and show results separated for males and females (where separate benchmarks are used for males and females).

Years behind the frontier PPD

We also used the frontier PPD as a benchmark, instead of the global PPD. The frontier PPD was defined as the country with the lowest PPD within each year (excluding countries with a population below 3 million in 2019). Since the earliest PPD observed was 1950, and some regions were further behind the frontier PPD than 1950, we supplemented the UN WPP data with data from the Human Mortality Database (HMD),¹⁴ which provides age-specific mortality probabilities extending back to 1751. The early HMD estimates were only available for a few countries: however, these now-high-income countries (eg, Sweden, Norway, France), were likely to be (or at least close to being) the global frontier before 1950. We removed increases in frontier PPD between years: therefore, the interpretation of the frontier is the lowest PPD demonstrated to be possible with the best living standards and most advanced technology available each year.

Estimating years behind or ahead of Preston curves

The Preston curve is a seminal concept relating life expectancy to per capita aggregate income.⁸ With technological advancements, the Preston curve is expected to shift upwards across time, such that the same levels of income would result in better life expectancy in more recent years.^{12,13}

For this analysis, we first estimated Preston curves for each year 1950–2019 to use as benchmarks. Pooling all years and the 169 countries with available GDP data (see table S1), we estimated a linear regression of PPD on (log) real per capita GDP and separate intercepts for each year (table S3 and figures S1–S3). Technological advancements result in the intercepts shifting downward, such that in more recent years, lower PPD should be achieved for the same level of GDP. This shift in the Preston curve across time allows us to estimate how far behind or ahead regions were from the 2000 and 2019 Preston curves given their

GDP and PPD. (We observed a few cases where the intercepts moved slightly upward across years, and adjusted these such that the intercept each year was the lowest ever observed since 1950.)

First, we determined whether the PPD observed in a region in 2019 was higher or lower than the PPD predicted by that region's 2019 per capita GDP. In other words, we determined whether a region was above (behind) or below (ahead) the 2019 Preston curve. The region was behind the Preston curve in 2019 if its observed PPD was greater than the PPD predicted from the Preston curve, meaning that the region had a higher PPD than expected given its level of income. Then, we identified the most recent Preston curve where the target region's 2019 per capita GDP predicted a greater PPD than was observed in that region in 2019.

Conversely, the region was ahead of the Preston curve in 2019 if its observed PPD was lower than the PPD predicted from the 2019 Preston curve. Then, we identified the most recent Preston curve where the target region's 2019 per capita GDP predicted a PPD lower than that observed in that region in 2019.

As a sensitivity analysis, we moved away from Preston curves when estimating years behind relative to per capita GDP, and allowed for a more flexible relationship between per capita GDP and PPD. We regressed PPD on an intercept and log of per capita GDP for each year separately, obtaining year-specific intercepts and year-specific GDP slopes (table S3 and figures S1). Using this specification, the predicted PPD across the distribution of per capita GDP could intersect between different years, which goes against what would be suggested by the Preston curve (the same level of per capita GDP would generally not predict a lower PPD in an earlier year than a later year; in other words, the amount of health for a given per capita GDP should increase across years). Using this more flexible equation, we determined years

behind or ahead for a given level of GDP the same as when using the Preston curves (referring to the most recent year a lower PPD was observed for a given GDP).

All analyses were conducted using Stata 16 (Stata Corp).

Results

Years behind or ahead of the global average PPD

The global PPD fell from 67% in 1950 to 32% in 2019 (figure 1). Three regions had a PPD behind the global PPD in 2019: sub-Saharan Africa, Central Asia, and India. For example, India's PPD was 36.9% in 2019: the most recent year the global PPD was greater than 36.9% was 2006 (when it was 37.2%, falling to 36.7% in 2007). The last year that the global PPD was as low as in sub-Saharan Africa in 2019 was 1975, when it was 52%. Central Asia had a PPD of 40% in 2019, which was last observed for the global PPD in 2000. This means that sub-Saharan Africa was 44 years behind the global PPD in 2019, while Central Asia was 19 years behind and India 13 years behind (figure 2). In 2000, sub-Saharan Africa was further behind the global PPD, or 48 years behind. India's relative gains were larger, having been 20 years behind in 2000.

Other regions were ahead of the global average PPD. For example, China had a PPD of 21% in 2019. The last year China had a PPD above the 2019 global PPD (32%) was in 1997, when it was 32.5% (falling to 31.9% in 1998), putting China 22 years ahead of the global PPD. China made gains in PPD relative to the global PPD, having been 13 years ahead in 2000. The North Atlantic was the furthest ahead of the global PPD both in 2000 and 2019, or 49 and 44 years ahead, respectively. The United States was 43 years ahead of the global PPD in

2000 and 39 years ahead in 2019. Central & Eastern Europe went from being 9 years behind in 2000 to three years ahead of the global PPD in 2019.

Among the 30 largest countries, Japan and Spain were furthest ahead of the global PPD in 2019, by 49 years and 48 years, respectively, followed by Italy at 47 years and France at 44 years ahead. Nigeria was the furthest behind, 65 years, followed by Kenya, 48 years behind, and the Democratic Republic of the Congo (Congo DR), 43 years (figure S4).

The North Atlantic was closest to the frontier PPD, having a PPD of 15%, last observed in the frontier in 2003 (figure 3). Sub-Saharan Africa was the furthest behind the frontier, with a PPD of 52% in 2019, last observed in the frontier in 1919.

Changes 2019–2023 and sex-differences

Regions that were the furthest ahead of the global average PPD in 2019, the North Atlantic, United States, and China, moved further ahead in 2023 (figure S5). Regions that less far ahead regressed closer to the global average PPD 2019–2023: Central & Eastern Europe (which was below the global average PPD in 2023), Western Pacific & Southeast Asia, and especially Latin America & the Caribbean and the Middle East & North Africa. Regions below the global average PPD in 2019—India, Central Asia, and sub-Saharan Africa—remained similarly positioned relative to the global average PPD in 2019 and 2023. Among the 30 most populous countries, those ahead of the global PPD in 2019 were further ahead in 2023 and those behind in 2019 were further behind in 2023 (figures S6).

Among the 10 regions highlighted, sex differences were particularly large in Central & Eastern Europe, where males were 14 years behind in 2019 while females were 13 years ahead (figures S7). In 2019, females were 13 years further ahead than men in the United

States, 12 in the North Atlantic, five in Latin America & the Caribbean, four in Western Asia & Pacific, two in China, and one in the Middle East & North Africa. Meanwhile, males were five years further behind than women in Central Asia, and females were six years further behind than males in India and four years in sub-Saharan Africa.

Behind or ahead of the Preston curve

The United States, Central & Eastern Europe, sub-Saharan Africa, Central Asia, and India were all above the 2019 Preston curve (figure 4). That is, they had a greater PPD than predicted by their GDP. For example, in 2019, India had a per capita GDP of around \$7300 and a PPD of 37% (table S2). Meanwhile, the 2019 Preston curve predicted a PPD of 36% for a \$7300 per capita GDP: therefore, India was behind (or above) the Preston curve in 2019. The most recent Preston curve to predict a PPD below 37% for a per capita GDP of \$7300 was in 2000, putting India 19 years behind the 2019 Preston curve (figures S2–S3). The United States was the furthest behind considering its per capita GDP, being on the 1974 Preston curve in 2019. Meanwhile, Central & Eastern Europe was on the 1976 Preston curve, sub-Saharan Africa on the 1982 curve, Central Asia on the 1997 curve.

The United States had the largest shift backward, being 27 years behind the expected PPD given its GDP in 2000 and 45 years behind in 2019 (figure 5). Central & Eastern Europe also moved backward, from being 29 years behind in 2000 to being 43 years behind the Preston curve in 2019. Central Asia also had a large backward slide, from being 12 years behind in 2000 to 22 years behind in 2019. Sub-Saharan Africa witnessed a small improvement, being 39 years behind in 2000 and 37 in 2019.

Other regions were ahead of the Preston curve. For example, in 2019, China had a per capita GDP of almost \$17 000 and a PPD of 21% (table S2). The 2019 Preston curve predicted a

PPD of 27% for \$17 000 per capita GDP. The most recent year a GDP of \$17 000 predicted a PPD above 21% was 2006, putting China 13 years ahead of the Preston curve in 2019. The North Atlantic was 1 year ahead of the Preston curve in 2000 and 12 years ahead in 2019.

Nigeria and South Africa were further behind the Preston curve than 1950, meaning the years behind could not be calculated (figure S8). Otherwise, Russia, Kenya, and the United States were the furthest behind the Preston curve in 2019, while Vietnam, Japan, Spain, and Italy were the furthest ahead.

Using a more flexible specification when predicting PPD for a given GDP shows largely similar results as using Preston curves with fixed slopes and non-decreasing intercepts across years (figure S9). The largest absolute difference between the two model specifications, among the 10 main regions studied was for the United States, which was eight fewer years behind, and slightly less behind than sub-Saharan Africa.

Discussion

The global average PPD fell from 67% in 1950 to 32% in 2019. However, the progress has been uneven, with sub-Saharan Africa, Central Asia, and India lagging. Sub-Saharan Africa and India converged somewhat towards the global PPD between 2000 and 2019. However, our supplementary analysis revealed that between 2019 and 2023, during the emergency phase of the COVID-19 pandemic, a small divergence occurred, where countries that were ahead moved further ahead and those behind moved further behind, among the 30 most populous countries. When considering the PPD expected for a given per capita GDP using Preston curves, sub-Saharan Africa, Central & Eastern Europe, and the United States were furthest behind (above) the 2019 PPD Preston curve.

Together these results highlight an uneven process of mortality improvements across regions, both overall and when considering the mortality expected for a given level of economic development. In 2019, sub-Saharan Africa, for example, had a combination of health enhancing technologies and living standards last observed for the world average in 1975. If considering the best PPD ever observed each year (the frontier PPD) instead of global PPD, sub-Saharan Africa could be considered hundred years behind the PPD possible if given the best available health enhancing technology and living standard. The relative lag in the mortality decline observed in sub-Saharan Africa, Central Asia, and India may reflect a wide range of factors, such as difficulties in implementing and accessing health enhancing innovation, low living standards, and unique challenges related to these contexts.

Despite enormous improvements, sub-Saharan Africa continues to have high mortality from infectious diseases and neonatal and maternal conditions, due to a lack of basic healthcare and public services for much of the population.¹⁵ Although infectious diseases and neonatal conditions continue to play a sizable role in premature mortality in Central Asia and India, non-communicable diseases are increasingly driving premature mortality differentials, suggesting a need for control of risk factors, particularly to tackle early deaths from cardiovascular disease (eg, smoking, hypertension, high cholesterol).¹⁶

Early advances in agricultural technology improved nutrition¹⁷ and discovery of the germ theory of diseases eventually led to improvements in sanitation, hygiene, and food standards, causing early declines in mortality and increased life expectancy in today's rich countries in the 19th and early 20th century.^{18,19} Implementing these early technological innovations required public action and major investments into large scale projects. Health improvements were, therefore, somewhat more contingent on economic growth. Over time these costs go down. Also, in the later 20th century, health enhancing innovations were to a larger extent

individually targeted medical interventions. For example, vaccines, oral rehydration therapy, and statins can have large health benefits at a low cost, enabling countries to achieve better health at a lower level economic development than before.²⁰ Therefore, the Preston curve has shifted, such that the same level of per capita GDP affords better health today than in the past.

The structural, historical, and sociopolitical context of each region plays a crucial role in shaping health outcomes at any level of economic development. Incomes may be unequally distributed, not spent on health, or even achieved through means that are detrimental to health. Conversely, countries can also make use of resources efficiently, prioritize health, implement cost-effective interventions, or practice healthy behaviors (eg, healthier diet and alcohol restrictions) and thereby achieve low mortality at low level of GDP.^{21,22} However, ultimately, aggregate income constrains living standards and the ability to implement effective health interventions—such as healthcare, public safety, and establishment and maintenance of water, sanitation, and other important infrastructure. Taking these economic constraints into account suggests that China manages to ensure high level of health for its level of economic development. Conversely, the results suggest that the United States, Central & Eastern Europe, sub-Saharan Africa, and Central Asia were behind the PPD expected given their level of aggregate income. The reasons why economic development does not translate into low mortality are likely to vary across these regions.

In the United States, for example, per capita GDP translates into health enhancing technologies and living standards to the same extent as in the average country 45 years earlier. Despite a high per capita GDP (and the highest global health care spending²³), the United States has high levels of economic inequality.²⁴ The individual income-health relationship tends to show diminishing marginal returns in health to increased income:

therefore, greater inequality at the same level of aggregate income will inevitably lead to higher observed mortality.^{25–27} Further, the healthcare systems in the United States suffers from spending waste²⁸ and gun violence (homicide and suicide) and road traffic deaths cause an unusually high loss of life for a rich country.¹⁵ Finally, the United States is going through a substance use epidemic, which has been claiming an increasing number of lives, especially since 2014.²⁹ In fact, despite continued economic growth, life expectancy in the United States has been declining.^{30,31}

Central & Eastern Europe has witnessed rapid economic growth, especially since 1990, but continues to have a large number of deaths due to alcohol misuse and suicide, especially among males.^{15,32} The prominence of the mining sector in sub-Saharan Africa and “the resource curse”—suggested to reduce human development by decreasing equality,³³ quality of institutions,³⁴ and public spending³⁵—may to an extent explain why it remains far behind of the Preston curve.³⁶

Our study has five key limitations. First, our conclusions rely on the quality and availability of mortality and economic data across regions. We relied on estimates from the UN WPP 2024 for the main analysis, which are widely used and generally considered reliable. Second, comparing regions based on years behind or ahead of global PPD progress simplifies complex temporal dynamics and regional disparities. Third, the links between per capita GDP and PPD estimated in our paper were not causal in either direction. However, our goal was to describe expected PPD for a given level of economic development, which does not imply causality. Fifth, the analyses were purely descriptive and do not provide explanations for the differences observed.

Conclusions

In the context of long run and largely uninterrupted declines in premature mortality, our comparative analytic approach illuminates uneven progress across regions. By comparing mortality disparities as years behind or ahead of the global curve, this study highlights the temporal nature of mortality declines across the world.

Competing interest

None.

Data availability

United Nations Population Prospects single age life tables are available at population.un.org. The Maddison Project per capita GDP is available at <https://www.rug.nl/>. Human Mortality Database is available at <https://www.mortality.org/>.

Code availability

Codes used to produce the estimates in this paper is available at <https://github.com/O-Karlsson/Probability-of-death-before-age-70-progress-as-years-behind-or-ahead-of-the-global-average-trend>.

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Role of the funding source

The funders played no role in the data collection and analysis, reporting and interpretation of results, or the decision to submit the manuscript for publication. Authors were not precluded from accessing data in the study, and they accept responsibility to submit for publication.

Contributions

Omar Karlsson did data management, analyses, reporting, and wrote the manuscript. Dean Jamison, Stéphane Verguet, Osondu Ogbuoji, and Omar Karlsson devised the conceptual idea of the paper. Stéphane Verguet and Osondu Ogbuoji provided critical feedback and edited the first draft of the manuscript. Gavin Yamey made substantial edits and provided critical feedback on the manuscript. All authors provided critical feedback on the manuscript. All authors approved the final manuscript as submitted and agree to be accountable for all aspects of the work.

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Ethical considerations

This project used publicly accessible aggregate data from the United Nations World Population Prospects and the Maddison Project. These activities do not meet the regulatory definition of human subjects research. As such, an Institutional Review Board review was not required.

Supplementary information

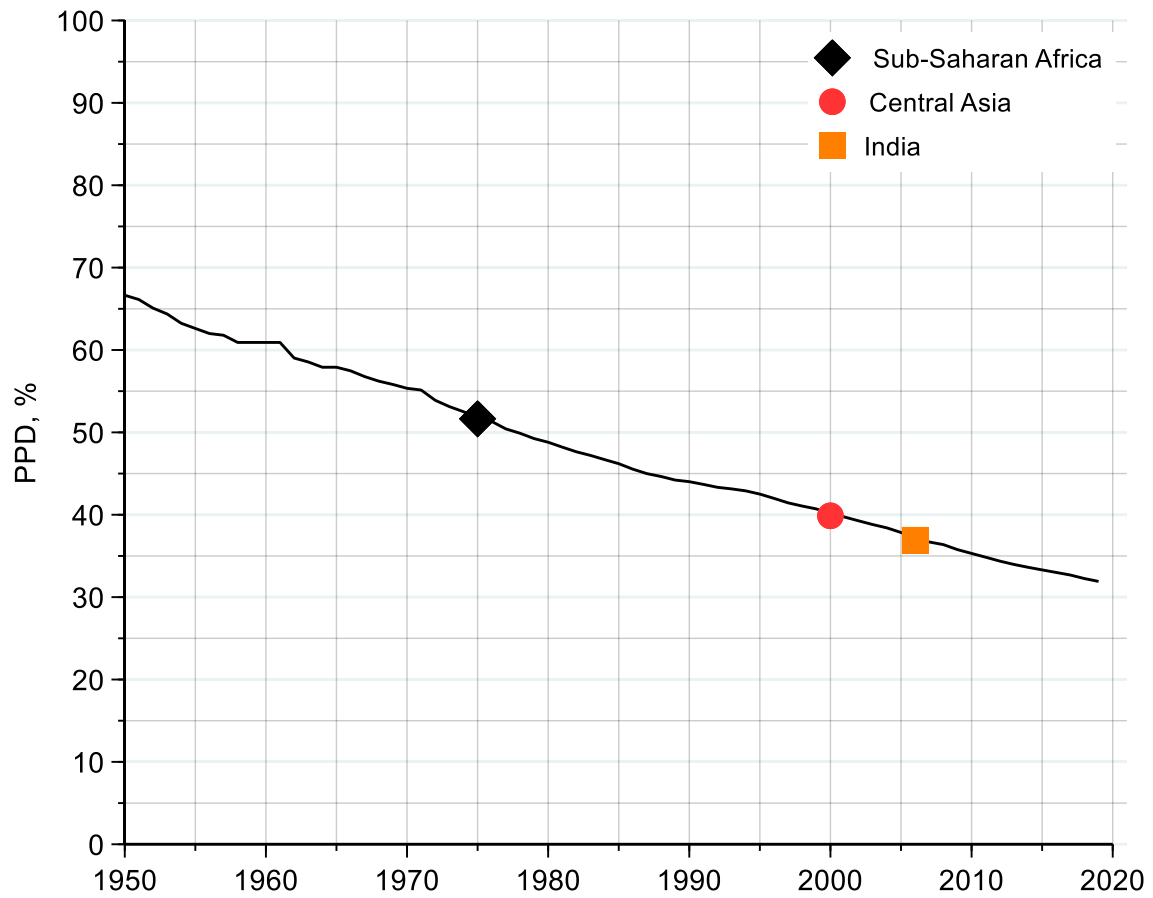
Supplements 1 and 2.

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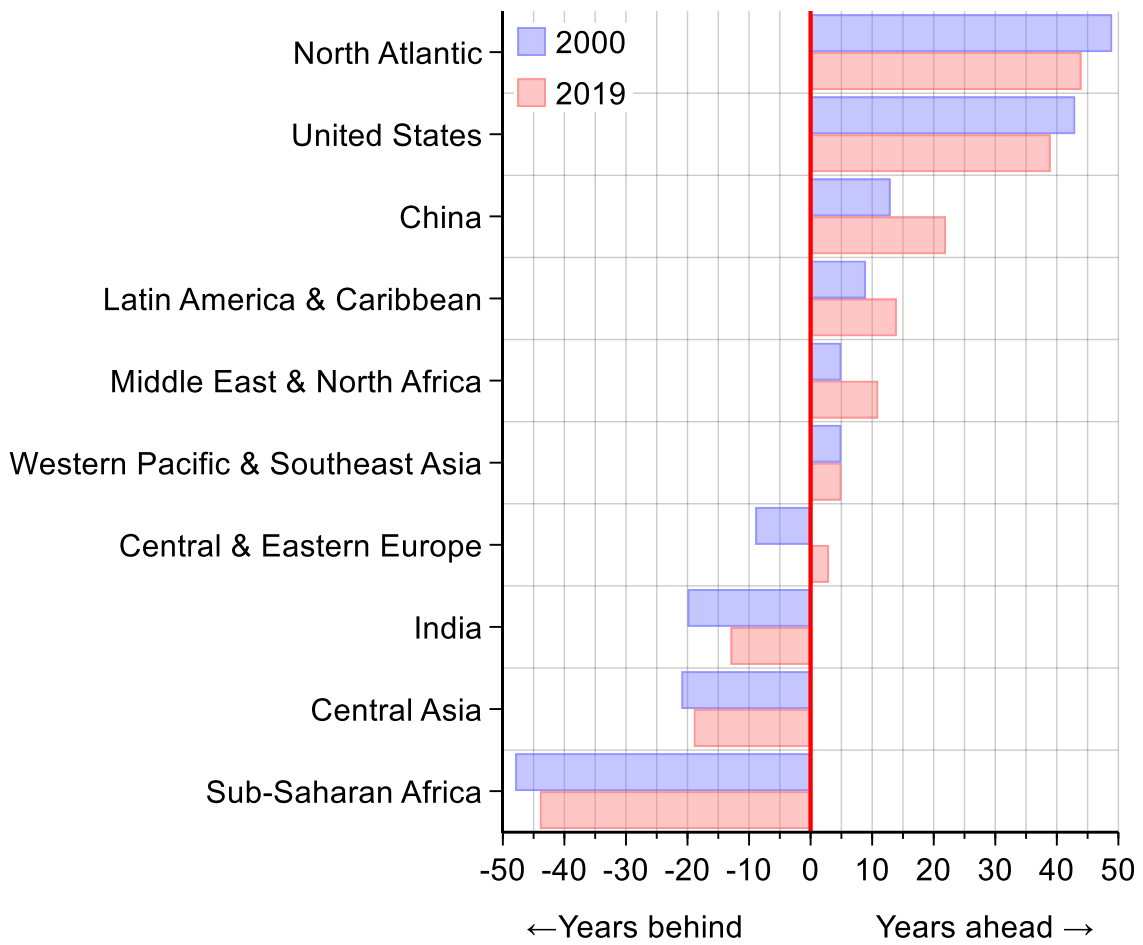
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Figure 1. Global PPD across time (line) and for regions in 2019 (markers)



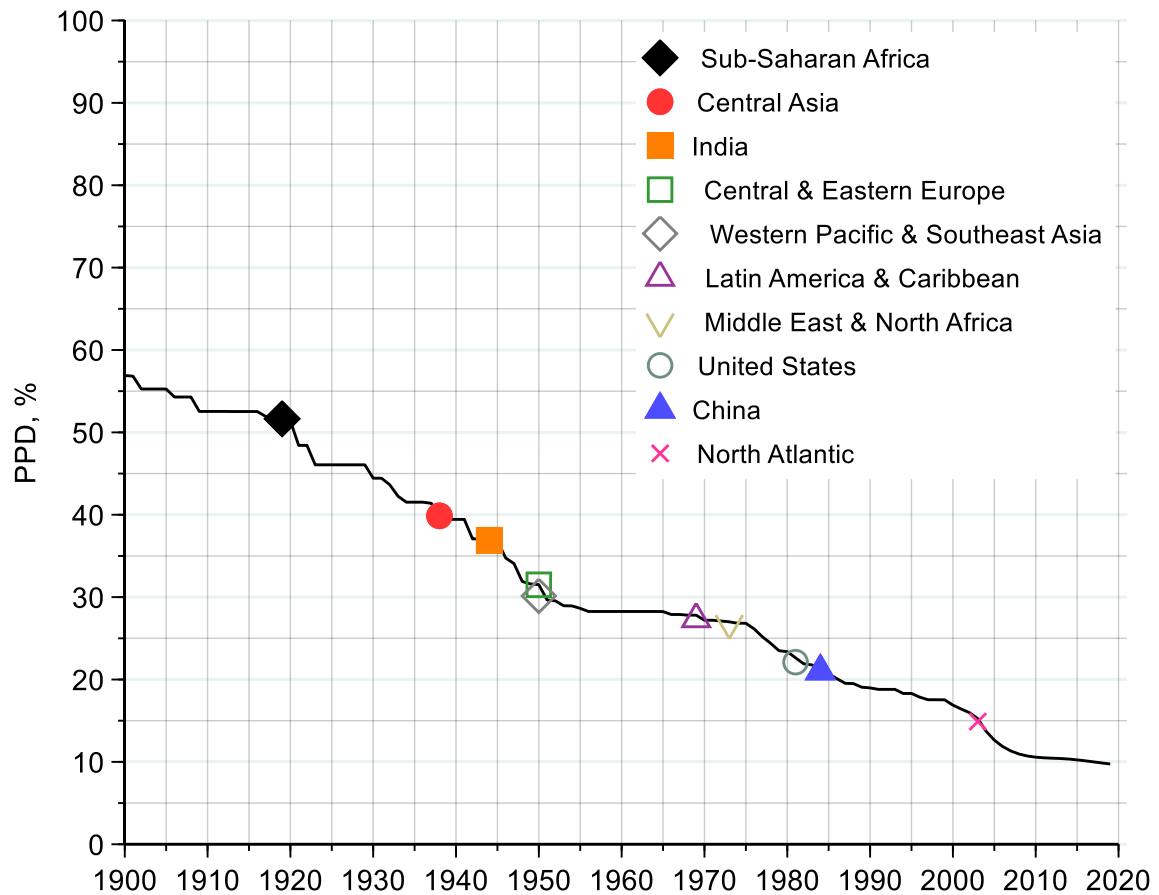
Notes: Probability of premature death (PPD) was defined as dying before age 70 years. The line shows Global PPD each year while the markers indicate PPD in 2019 for each location. The lowest global PPD ever observed is shown (ie, increases across years were removed). Regions with lower PPD than the global average are not shown. Data source: UN WPP 2024.

Figure 2. Years behind or ahead of the global PPD



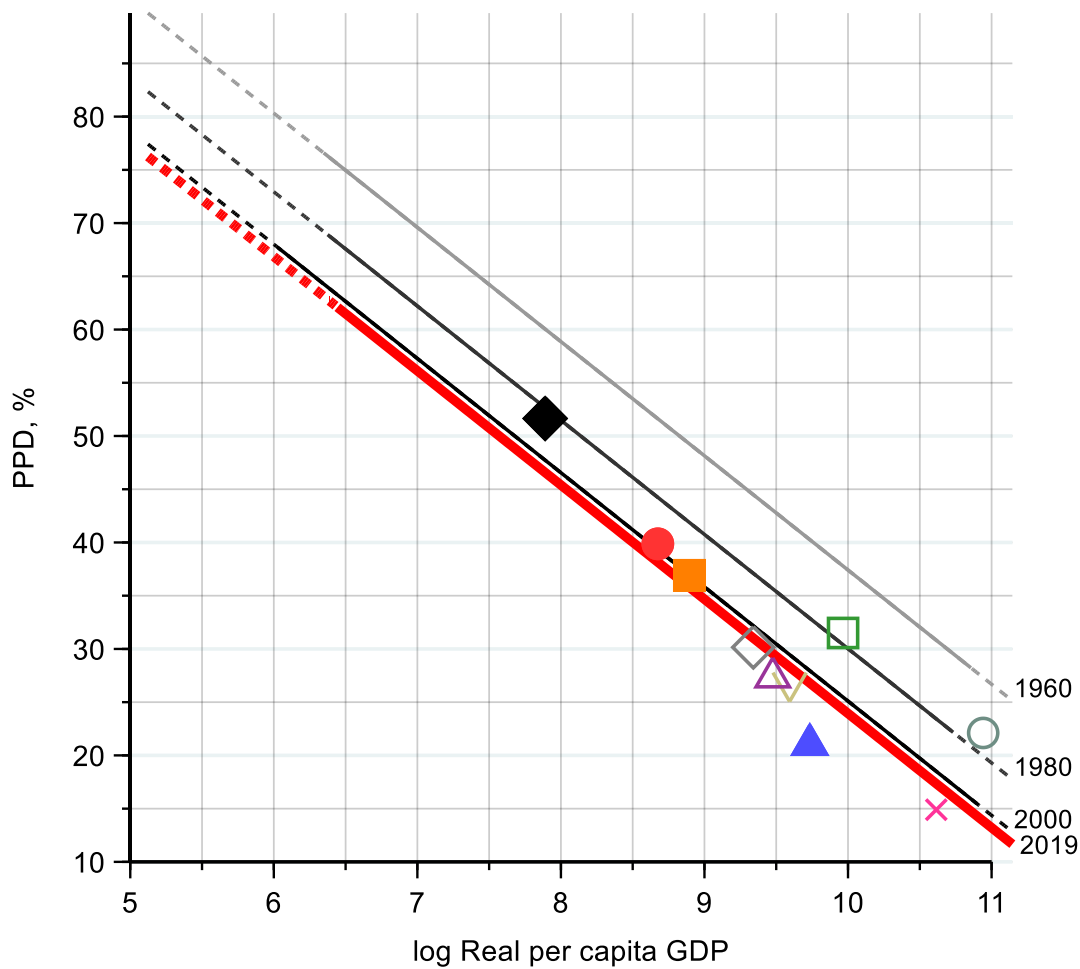
Notes: Probability of premature death (PPD) was defined as dying before age 70 years. Data source: UN WPP 2024.

Figure 3. Frontier PPD across time (line) and for regions in 2019 (markers)



Notes: Probability of premature death (PPD) was defined as dying before age 70 years. The line shows Frontier PPD each year while the markers indicate PPD in 2019 for each location. The frontier is the lowest PPD ever observed (ie, increases across years were removed). Countries with a population below 3 million in 2019 were not considered for being a frontier. Data source: UN WPP 2024 after 1950 and HMD 2024 before 1950.

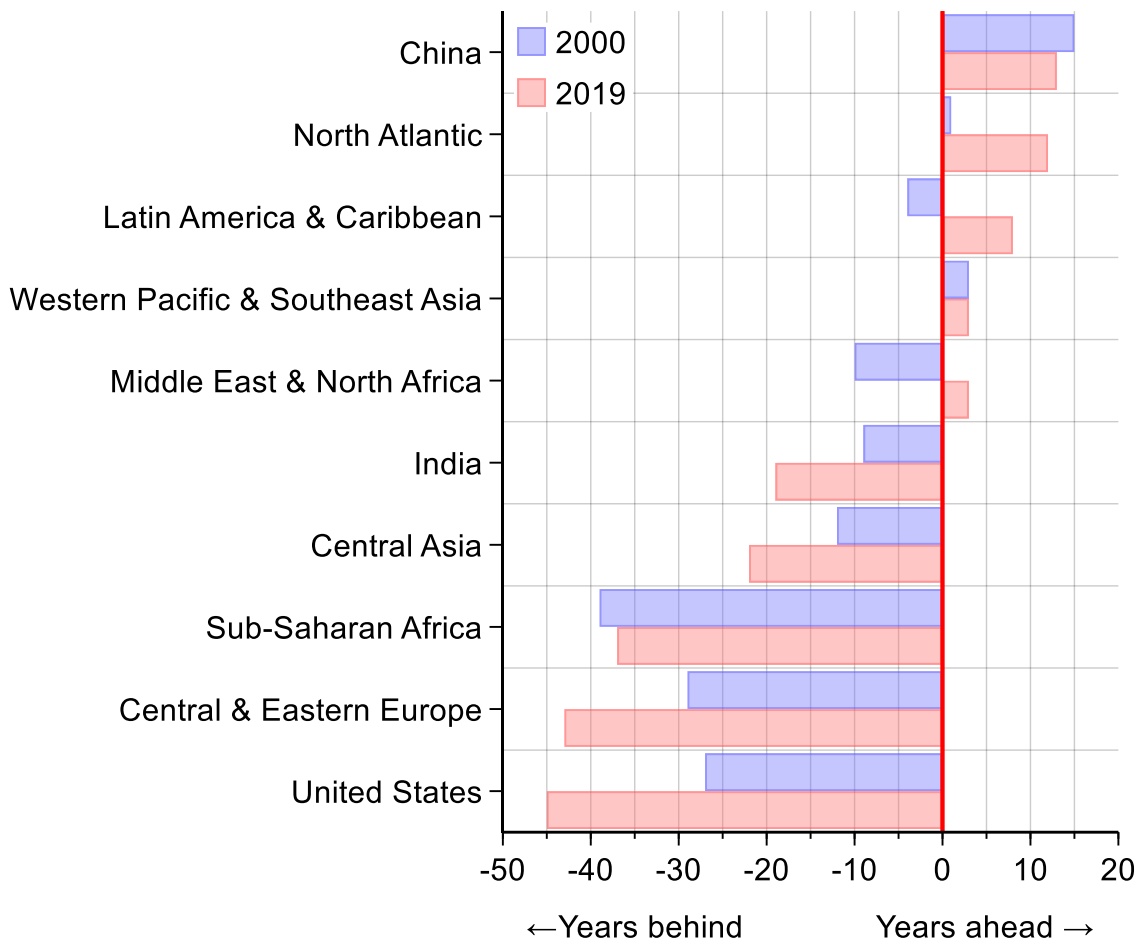
Figure 4. Preston curve (red line) and observed PPD and GDP for regions (markers) in 2019



PPD and GDP for regions in 2019	
○ United States	□ Central & Eastern Europe
◆ Sub-Saharan Africa	● Central Asia
■ India	▽ Middle East & North Africa
◇ Western Pacific & Southeast Asia	△ Latin America & Caribbean
× North Atlantic	▲ China

Notes: Probability of premature death (PPD) was defined as dying before age 70 years. Markers indicate PPD and GDP for each region in 2019. Red line shows the 2019 Preston curve. Preston curves for the years 1960, 1980, and 2000 are shown in gray for comparison. The dashed line indicates GDP beyond what was observed in that year. Preston curves were estimated for each year by regressing PPD on log of GDP with a separate intercept for each year. The slope for GDP is constant across years while the intercept varies across years. The intercepts were adjusted such that they never increased across years.

Figure 5. Years behind or ahead of the Preston curve



Notes: Probability of premature death (PPD) was defined as dying before age 70 years. Data source: UN WPP 2024 and the Maddison Project 2023.

Supplement: Probability of death before age 70: progress as years behind or ahead of the global average trend

Table S1: Regions and availability of GDP data in parentheses*	2
Table S2. PPD and GDP in 2000 and 2019	5
Table S3. Results from linear regressions of PPD on log of real GDP per capita	6
Figure S1. Predicted PPD at USD 10 000 GDP per capita from main model (before and after adjusting the year specific intercepts) and the sensitivity specification	8
Figure S2. Preston curves for different years (lines) and observed PPD and GDP for regions in 2019 (markers)	9
Figure S3. PPD predicted by Preston curves across years for different levels of GDP (lines) and observed PPD for regions in 2019 (markers)	10
Figure S4. Years behind or ahead of the global PPD: 30 most populous countries	11
Figure S5. Years behind or ahead of the global PPD: 2019 and 2023	12
Figure S6. Years behind or ahead of the global PPD: 30 most populous countries: 2019 and 2023	13
Figure S7. Years behind or ahead of the global PPD by sex	14
Figure S8. Years behind or ahead of the Preston curve: 30 most populous countries	15
Figure S9. Years behind or ahead relative to PPD predicted by current GDP: Alternative specification of PPD-GDP relationship	16

Table S1: Regions and availability of GDP data in parentheses*

Central & East- ern Europe	Central Asia	Latin America & the Caribbean	Middle East & North Africa	North Atlantic	Sub-Saharan Africa	Western Pac- ific & Asia
Albania	Afghanistan	Anguilla (No GDP)	Algeria	Andorra (No GDP)	Angola	American Samoa (No GDP)
Armenia	Azerbaijan	Antigua & Barbuda (No GDP)	Bahrain	Austria	Benin	Australia
Belarus	Kazakhstan	Argentina	Egypt, Arab Rep.	Belgium	Botswana	Bangladesh
Bosnia & Herzegovina	Kyrgyz Republic	Aruba (No GDP)	Iran, Islamic Rep.	Bermuda (No GDP)	Burkina Faso	Bhutan (No GDP)
Bulgaria	Mongolia	Bahamas, The (No GDP)	Iraq	Canada	Burundi	Brunei Darussalam (No GDP)
Croatia	Pakistan	Barbados	Israel	Cyprus	Cabo Verde	Cambodia
Czechia	Tajikistan	Belize (No GDP)	Jordan	Denmark	Cameroon	Cook Islands (No GDP)
Estonia	Turkmenistan	Bolivia	Kuwait	Faroe Islands (No GDP)	Central African Republic	Fiji (No GDP)
Georgia	Uzbekistan	Bonaire, Sint Eustatius & Saba (No GDP)	Lebanon	Finland	Chad	French Polynesia (No GDP)
Hungary		Brazil	Libya	France	Comoros	Guam (No GDP)
Kosovo (No GDP)		British Virgin Islands (No GDP)	Morocco	Germany	Congo, Dem. Rep.	Hong Kong SAR, China
Latvia		Cayman Islands (No GDP)	Oman	Gibraltar (No GDP)	Congo, Rep.	Indonesia
Lithuania		Chile	Qatar	Greece	Côte d'Ivoire	Japan
Moldova		Colombia	Saudi Arabia	Greenland (No GDP)	Djibouti	Kiribati (No GDP)
Montenegro		Costa Rica	Syria	Guernsey (No GDP)	Equatorial Guinea	Korea, Dem. People's Rep.
North Macedonia		Cuba	Tunisia	Iceland	Eritrea (No GDP)	Korea, Rep.
Poland		Curaçao (No GDP)	Türkiye	Ireland	Eswatini	Lao PDR
Romania		Dominica	United Arab Emirates	Isle of Man (No GDP)	Ethiopia	Macao SAR, China (No GDP)
Russia		Dominican Republic	West Bank & Gaza	Italy	Gabon	Malaysia
Serbia		Ecuador	Yemen, Rep.	Jersey (No GDP)	Gambia, The	Maldives (No GDP)
Slovak Republic		El Salvador		Liechtenstein (No GDP)	Ghana	Marshall Islands (No GDP)
Slovenia		Falkland Islands (No GDP)		Luxembourg	Guinea	Micronesia, Fed. Sts. (No GDP)
Ukraine		French Guiana (No GDP)		Malta	Guinea-Bissau	Myanmar
		Grenada (No GDP)		Monaco (No GDP)	Kenya	Nauru (No GDP)
		Guadeloupe (No GDP)		Netherlands	Lesotho	Nepal
		Guatemala		Norway	Liberia	New Caledonia (No GDP)

Central & East- ern Europe	Central Asia	Latin America & the Caribbean	Middle East & North Africa	North Atlantic	Sub-Saharan Africa	Western Pac- ific & Asia
		Guyana (No GDP) Haiti		Portugal Saint Pierre & Miquelon (No GDP)	Madagascar Malawi	New Zealand Niue (No GDP)
		Honduras		San Marino (No GDP)	Mali	Northern Mariana Islands (No GDP)
		Jamaica Martinique (No GDP)		Spain Sweden	Mauritania Mauritius	Palau (No GDP) Papua New Guinea (No GDP)
		Mexico Montserrat (No GDP) Nicaragua Panama Paraguay Peru Puerto Rico Saint Barthelemy (No GDP)		Switzerland United Kingdom	Mayotte (No GDP) Mozambique Namibia Niger Nigeria Reunion (No GDP) Rwanda Saint Helena (No GDP)	Philippines Samoa (No GDP) Singapore Solomon Islands (No GDP) Sri Lanka Taiwan, China Thailand Timor-Leste (No GDP)
		Sint Maarten (Dutch part) (No GDP) St. Kitts & Nevis (No GDP) St. Lucia St. Martin (French part) (No GDP) St. Vincent & the Grenadines (No GDP) Suriname (No GDP)			Senegal	Tokelau (No GDP)
		Trinidad & Tobago Turks & Caicos Islands (No GDP) Uruguay Venezuela, RB Virgin Islands (U.S.) (No GDP)			Seychelles Sierra Leone Somalia (No GDP)	Tonga (No GDP) Tuvalu (No GDP) Vanuatu (No GDP)
					South Africa	Vietnam
					South Sudan (No GDP) Sudan São Tomé & Príncipe	Wallis & Futuna (No GDP)
					Tanzania Togo Uganda Western Sahara (No GDP) Zambia	

Central & East-
ern Europe

Central
Asia

Latin America &
the Caribbean

Middle East &
North Africa

North
Atlantic

Sub-Saharan
Africa

Western Pac-
ific & Asia

Zimbabwe

Notes: *Countries without a year range in parentheses have complete GDP data 1950–2019. India, China, and the United States were considered separately and had complete GDP data.

Table S2. PPD and GDP in 2000 and 2019

	PPD 2000	GDP 2000	PPD 2019	GDP 2019
Central & Eastern Europe	43.63	9,168	31.50	21,282
Central Asia	48.84	2,958	39.87	5,856
China	30.75	4,730	21.01	16,880
India	48.57	2,753	36.92	7,294
Latin America & Caribbean	35.20	9,380	27.35	13,042
Middle East & North Africa	36.98	8,299	26.87	14,665
North Atlantic	20.56	32,588	14.91	40,716
Sub-Saharan Africa	64.99	1,523	51.65	2,672
United States	25.13	45,886	22.11	56,469
Western Pacific & Southeast Asia	37.92	5,868	30.15	11,387
World	40.17	5,625	31.91	10,954

Notes: Probability of premature death (PPD) was defined as dying before age 70 years. GDP was per capita in 2011\$.

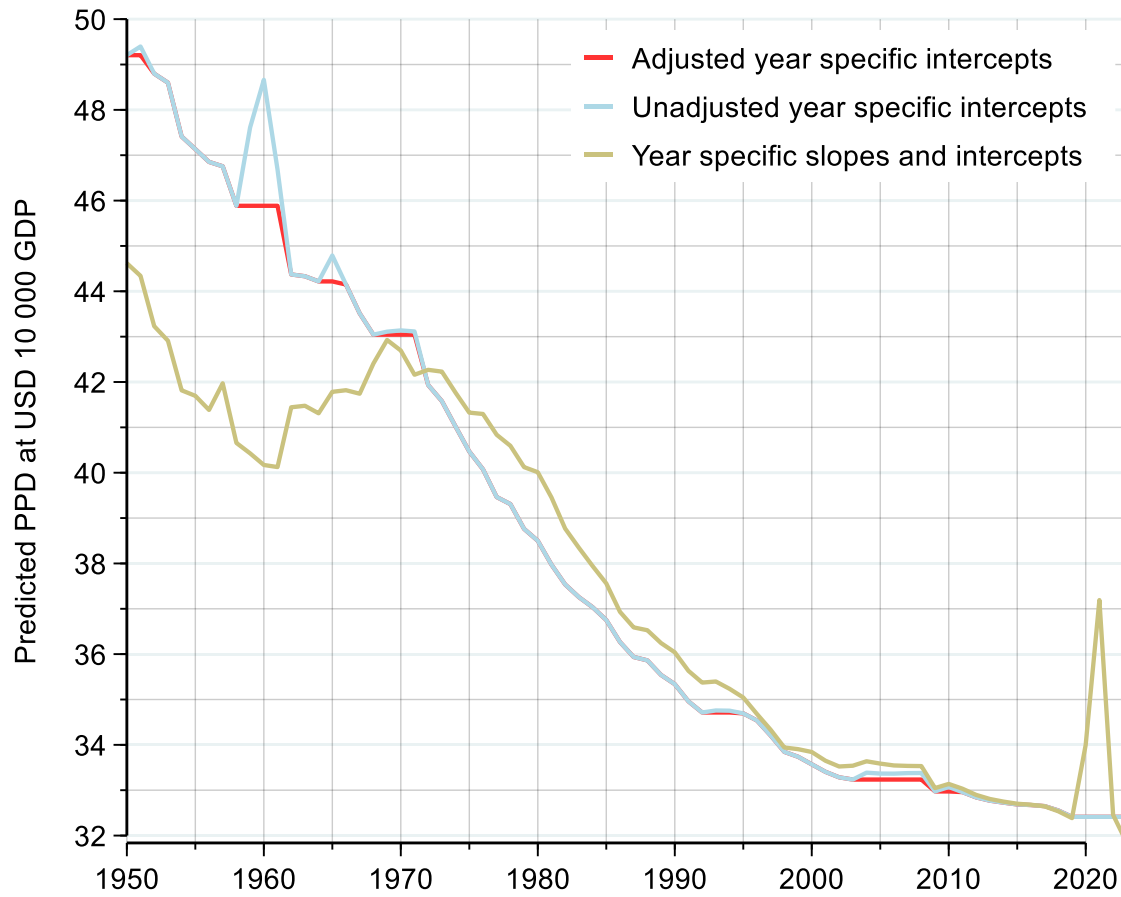
Table S3. Results from linear regressions of PPD on log of real GDP per capita

Year	Main model		Sensitivity check	
	Intercept	Coefficient	Intercept	Coefficient
1950	148.013	-10.728	169.436	-13.552
1951	148.204 (148.013)	-10.728	173.061	-13.976
1952	147.605	-10.728	175.859	-14.400
1953	147.407	-10.728	177.395	-14.601
1954	146.220	-10.728	175.590	-14.524
1955	145.941	-10.728	175.269	-14.503
1956	145.660	-10.728	175.912	-14.606
1957	145.563	-10.728	172.269	-14.147
1958	144.692	-10.728	173.964	-14.474
1959	146.419 (144.692)	-10.728	186.977	-15.911
1960	147.470 (144.692)	-10.728	196.097	-16.929
1961	145.492 (144.692)	-10.728	182.395	-15.447
1962	143.178	-10.728	160.075	-12.880
1963	143.139	-10.728	160.220	-12.892
1964	143.025	-10.728	161.185	-13.015
1965	143.595 (143.025)	-10.728	162.747	-13.133
1966	142.956	-10.728	157.983	-12.612
1967	142.320	-10.728	153.808	-12.167
1968	141.851	-10.728	146.014	-11.249
1969	141.917 (141.851)	-10.728	143.164	-10.883
1970	141.945 (141.851)	-10.728	145.111	-11.120
1971	141.922 (141.851)	-10.728	148.840	-11.583
1972	140.741	-10.728	138.294	-10.426
1973	140.386	-10.728	135.448	-10.121
1974	139.824	-10.728	134.117	-10.027
1975	139.275	-10.728	132.609	-9.911
1976	138.881	-10.728	129.321	-9.557
1977	138.271	-10.728	127.191	-9.376
1978	138.116	-10.728	127.328	-9.417
1979	137.568	-10.728	126.008	-9.325
1980	137.306	-10.728	124.203	-9.141
1981	136.780	-10.728	123.852	-9.163
1982	136.344	-10.728	125.440	-9.410
1983	136.064	-10.728	126.247	-9.544
1984	135.842	-10.728	127.381	-9.711
1985	135.559	-10.728	127.839	-9.802
1986	135.075	-10.728	128.572	-9.950
1987	134.744	-10.728	128.185	-9.945
1988	134.670	-10.728	127.764	-9.906
1989	134.348	-10.728	126.949	-9.848
1990	134.146	-10.728	126.779	-9.852
1991	133.765	-10.728	126.710	-9.889
1992	133.521	-10.728	126.517	-9.896
1993	133.565 (133.521)	-10.728	126.593	-9.901
1994	133.560 (133.521)	-10.728	128.146	-10.088
1995	133.501	-10.728	129.380	-10.242
1996	133.344	-10.728	131.557	-10.518
1997	133.013	-10.728	131.380	-10.537
1998	132.653	-10.728	131.414	-10.583
1999	132.544	-10.728	130.309	-10.467
2000	132.378	-10.728	128.547	-10.282
2001	132.213	-10.728	128.590	-10.308
2002	132.091	-10.728	128.339	-10.295

Year	Main model		Sensitivity check	
	Intercept	Coefficient	Intercept	Coefficient
2003	132.042	-10.728	126.867	-10.133
2004	132.193 (132.042)	-10.728	127.425	-10.183
2005	132.174 (132.042)	-10.728	127.459	-10.192
2006	132.172 (132.042)	-10.728	127.673	-10.220
2007	132.184 (132.042)	-10.728	127.469	-10.199
2008	132.186 (132.042)	-10.728	127.146	-10.164
2009	131.780	-10.728	129.129	-10.432
2010	131.877 (131.780)	-10.728	128.787	-10.385
2011	131.766	-10.728	127.642	-10.272
2012	131.649	-10.728	127.905	-10.315
2013	131.577	-10.728	128.282	-10.366
2014	131.533	-10.728	128.669	-10.414
2015	131.493	-10.728	128.314	-10.381
2016	131.480	-10.728	127.786	-10.326
2017	131.456	-10.728	127.512	-10.300
2018	131.360	-10.728	127.018	-10.258
2019	131.220	-10.728	126.535	-10.222
2020	131.220	-10.728	127.705	-10.174
2021	131.220	-10.728	135.249	-10.646
2022	131.220	-10.728	117.674	-9.252
2023	131.220	-10.728	117.185	-9.267

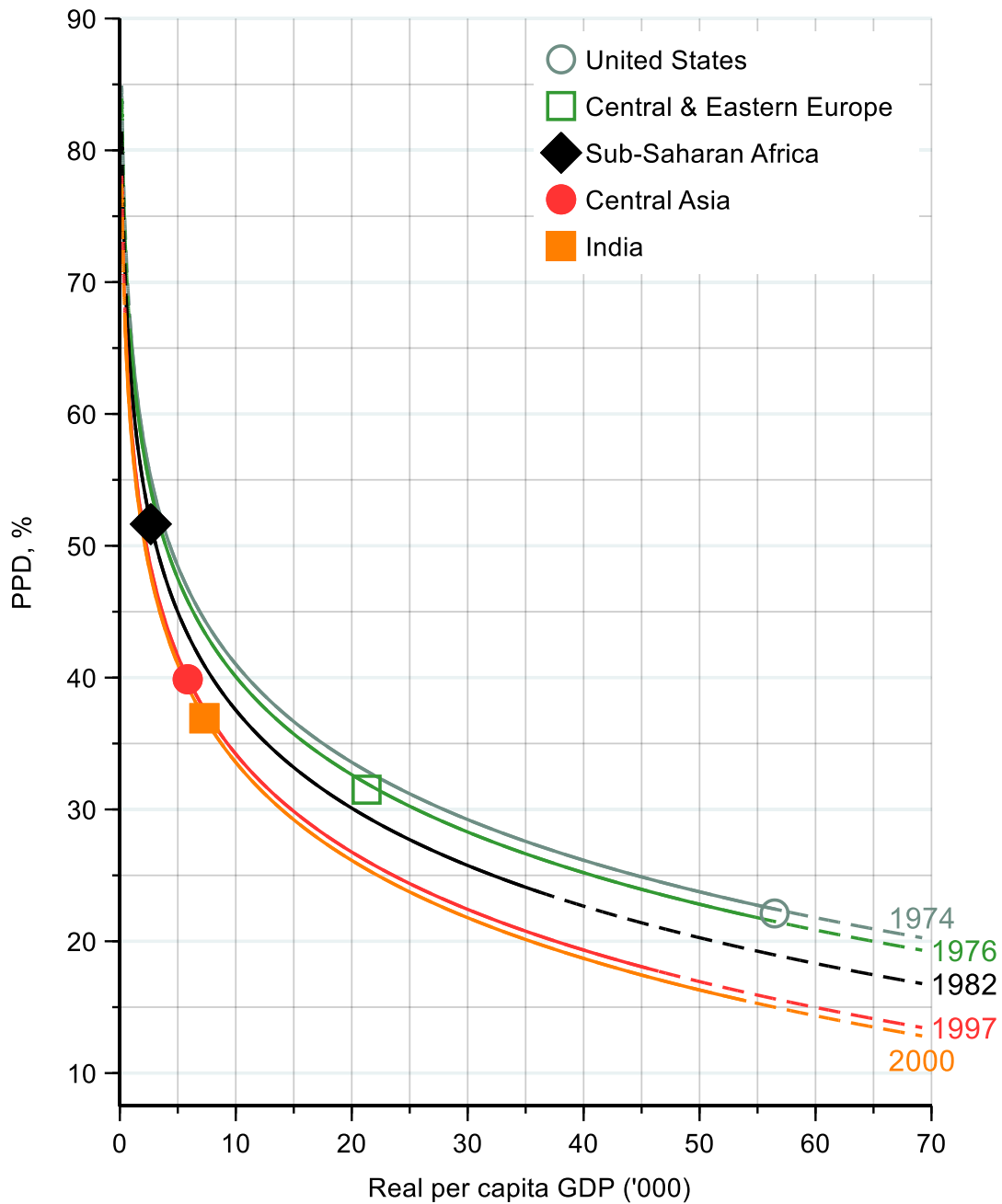
Notes: Probability of premature death (PPD) was defined as dying before age 70 years. Main model: Preston curves were estimated for each year by regressing PPD on log of real GDP per capita with a separate intercept for each year but a coefficient for GDP that was constant across years. In the main model, the intercepts shown in parenthesis were adjusted such that they never increased across years. The sensitivity check estimated the same models allowing the coefficient for GDP to vary across year. No adjustments were made to the intercepts in the sensitivity check. Data source: UN WPP 2022 and the Maddison Project 2023.

Figure S1. Predicted PPD at USD 10 000 GDP per capita from main model (before and after adjusting the year specific intercepts) and the sensitivity specification



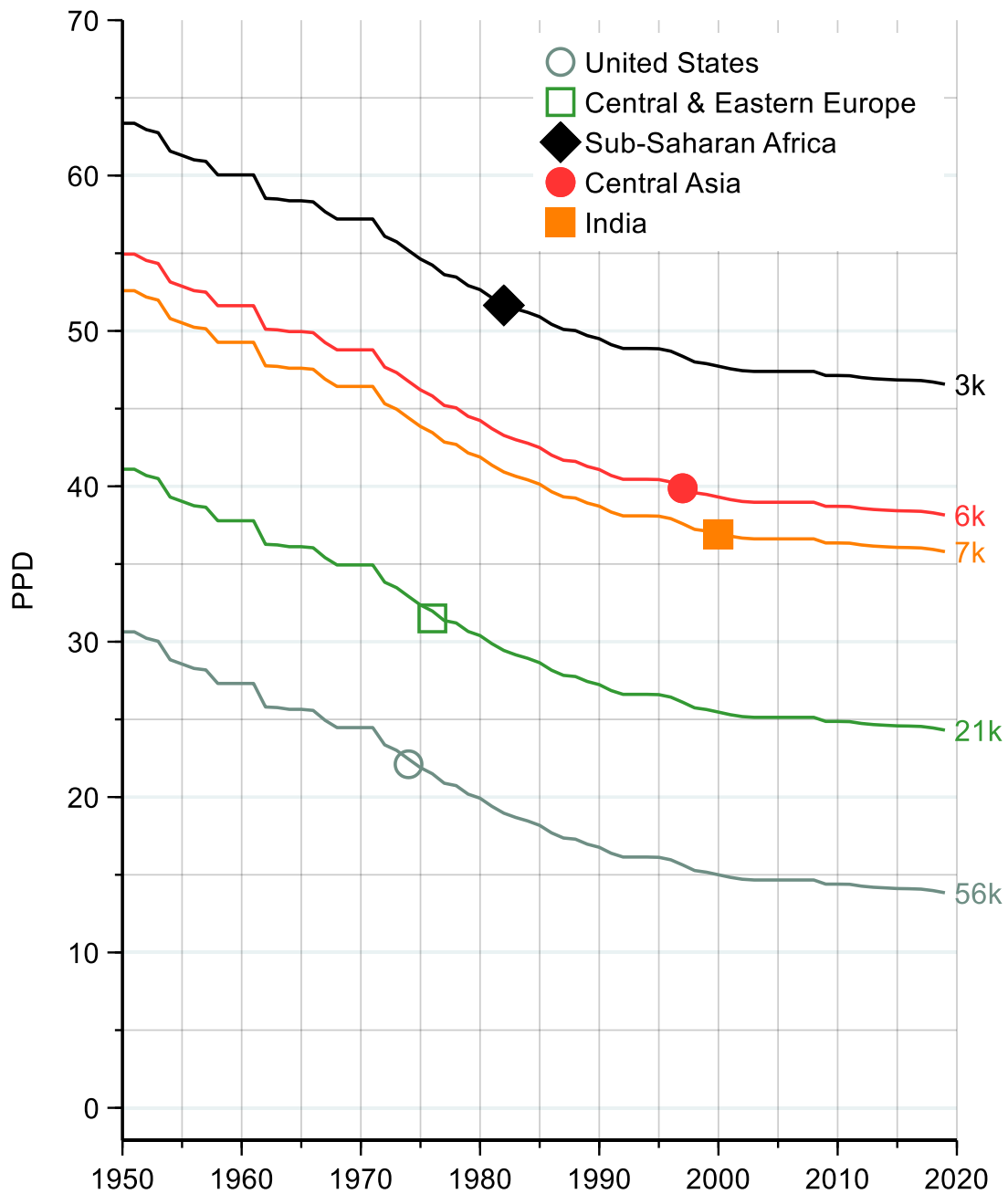
Notes: Probability of premature death (PPD) was defined as dying before age 70 years. Predicted PPD was estimated as PPD on log real GDP per capita and a separate intercept for each year. The year specific intercepts were adjusted such that they never decreased across years.

Figure S2. Preston curves for different years (lines) and observed PPD and GDP for regions in 2019 (markers)



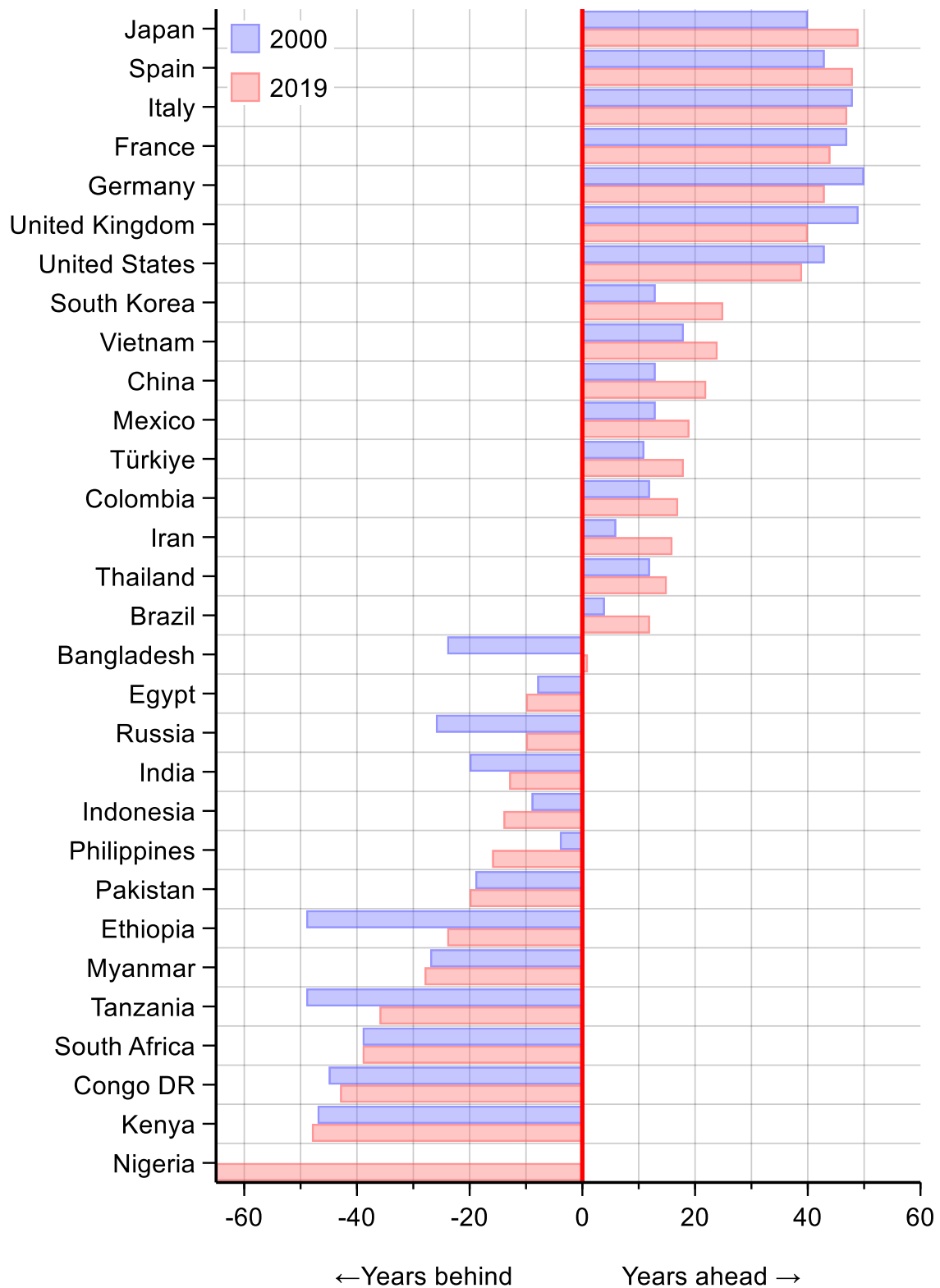
Notes: Probability of premature death (PPD) was defined as dying before age 70 years. Preston curves are shown for years which correspond to PPD and GDP in each region in 2019 (indicated at the bottom of each curve). Preston curves were estimated for each year by regressing PPD on log of GDP with a separate intercept for each year. The slope for GDP is constant across years while the intercept varies across years. The intercepts were adjusted such that they never increased across years. The dashed line indicates GDP beyond what was observed in that year. Regions with PPD below the 2019 Preston curve are not shown. Data source: UN WPP 2022 and the Maddison Project 2023.

Figure S3. PPD predicted by Preston curves across years for different levels of GDP (lines) and observed PPD for regions in 2019 (markers)



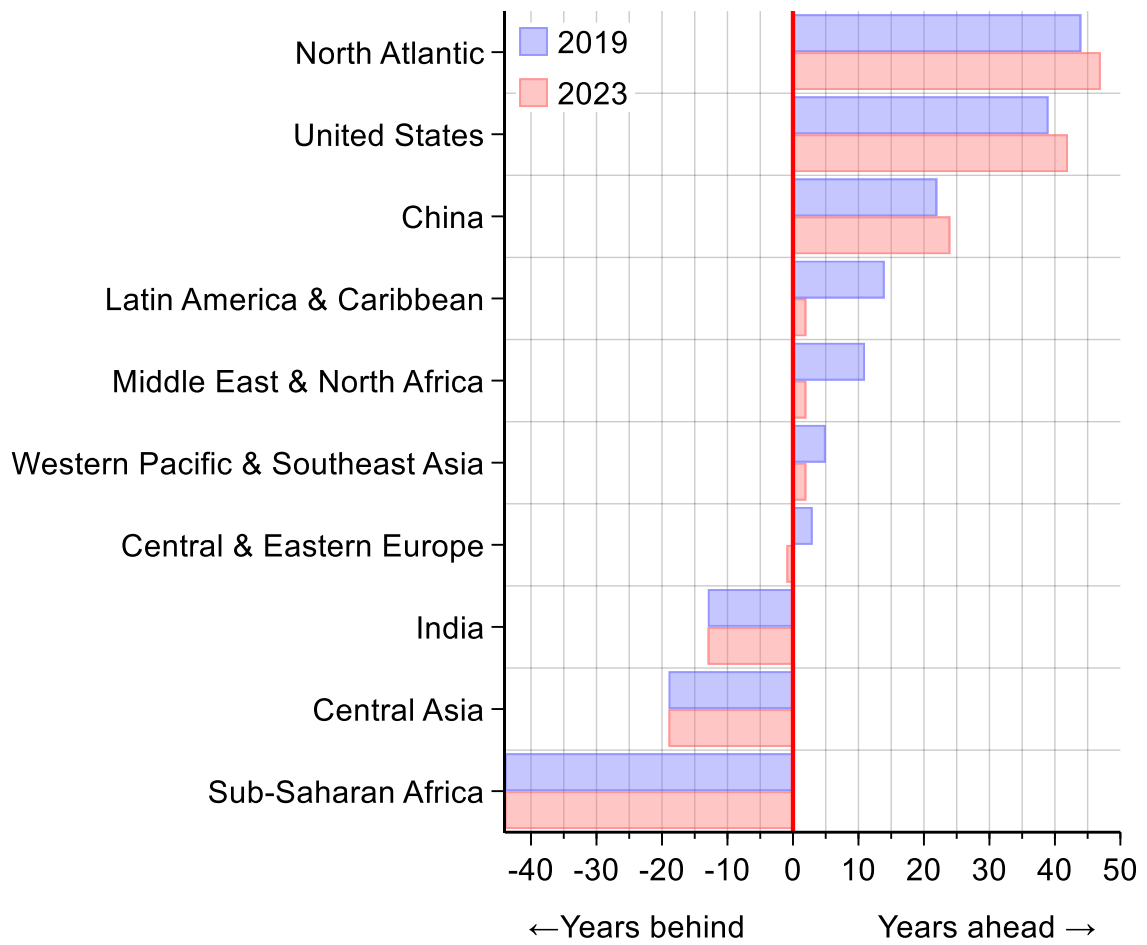
Notes: Probability of premature death (PPD) was defined as dying before age 70 years. Preston curves were estimated for each year by regressing PPD on log of GDP with a separate intercept for each year. The slope for GDP is constant across years while the intercept varies across years. The intercepts were adjusted such that they never increased across years. Regions with probability below the 2019 Preston curve are not shown. Data source: UN WPP 2022 and the Maddison Project 2023.

Figure S4. Years behind or ahead of the global PPD: 30 most populous countries



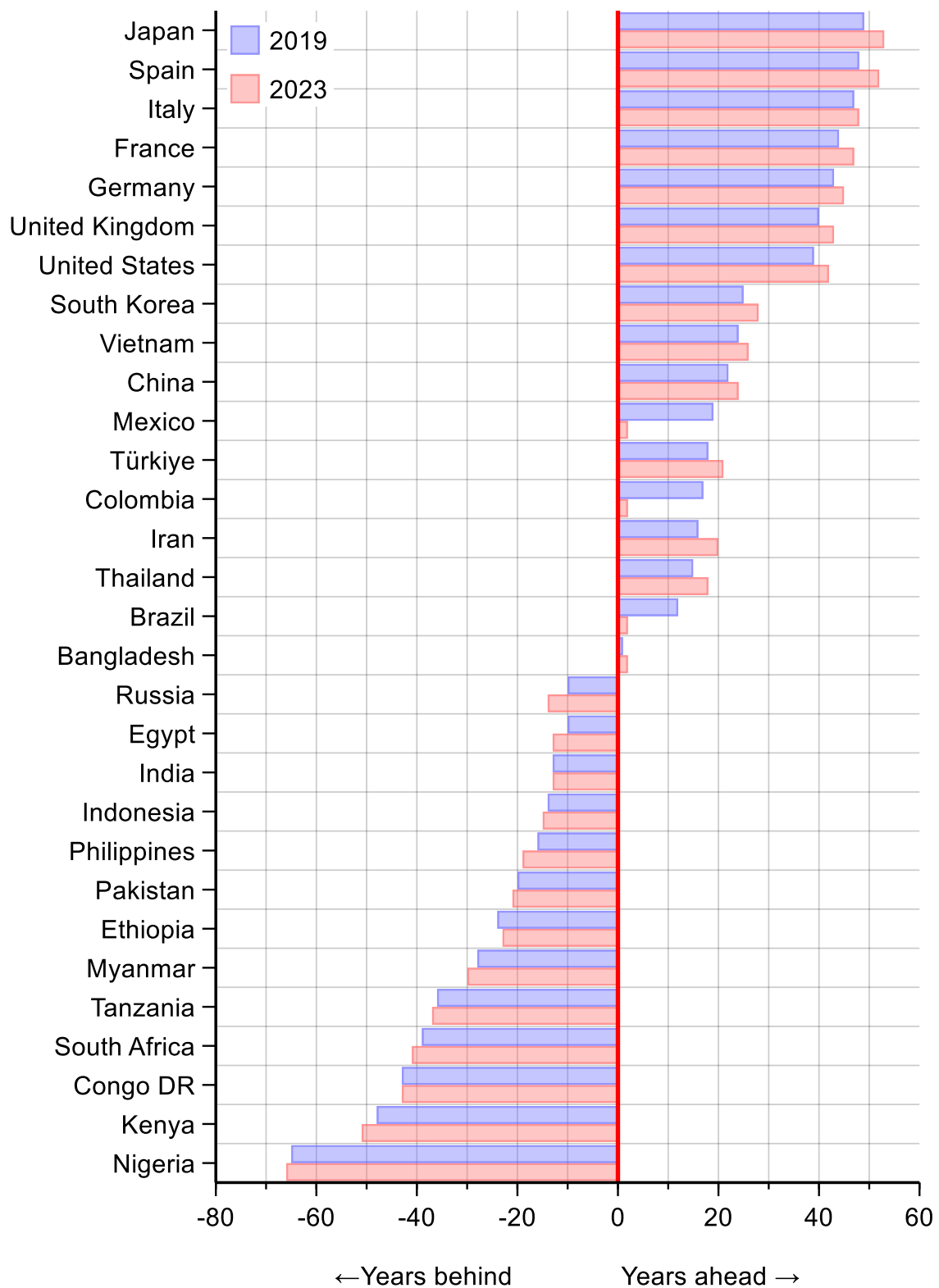
Notes: Probability of premature death (PPD) was defined as dying before age 70 years. Missing bars indicate being further behind than 1950 (the earliest available data). Data source: UN WPP 2022.

Figure S5. Years behind or ahead of the global PPD: 2019 and 2023



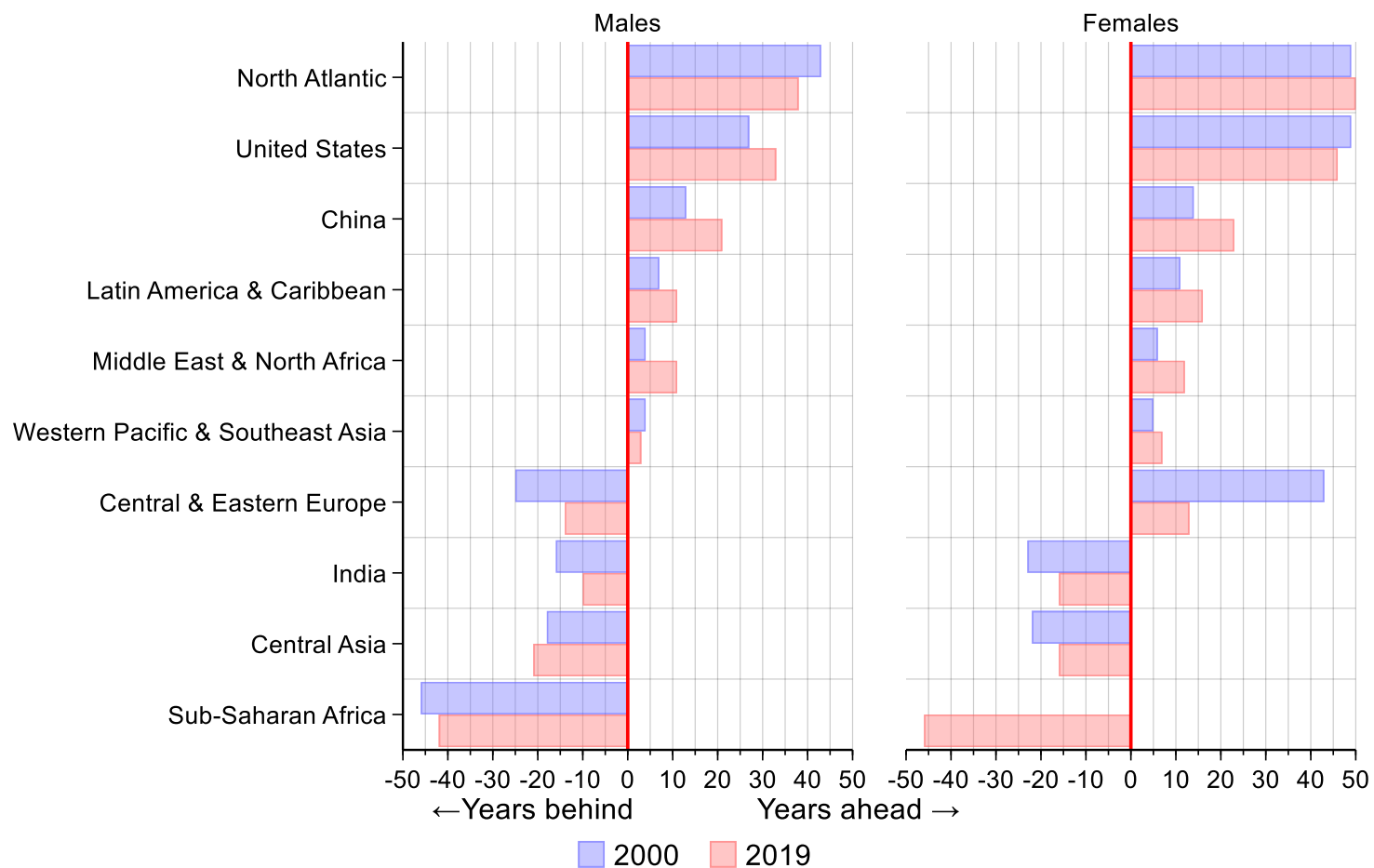
Notes: Probability of premature death (PPD) was defined as dying before age 70 years. Data source: UN WPP 2022.

Figure S6. Years behind or ahead of the global PPD: 30 most populous countries: 2019 and 2023



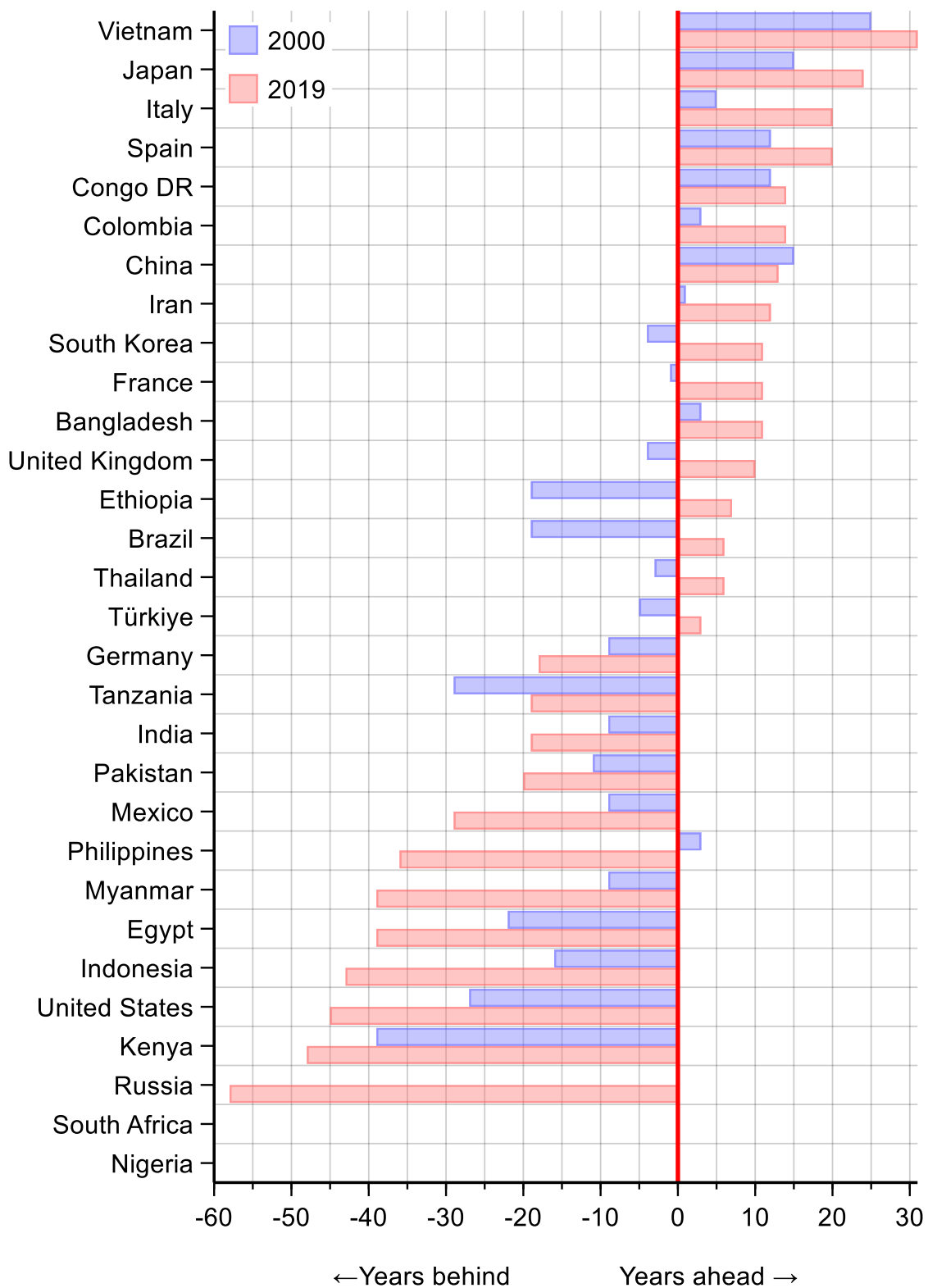
Notes: Probability of premature death (PPD) was defined as dying before age 70 years. Missing bars indicate being further behind than 1950 (the earliest available data). Data source: UN WPP 2022.

Figure S7. Years behind or ahead of the global PPD by sex



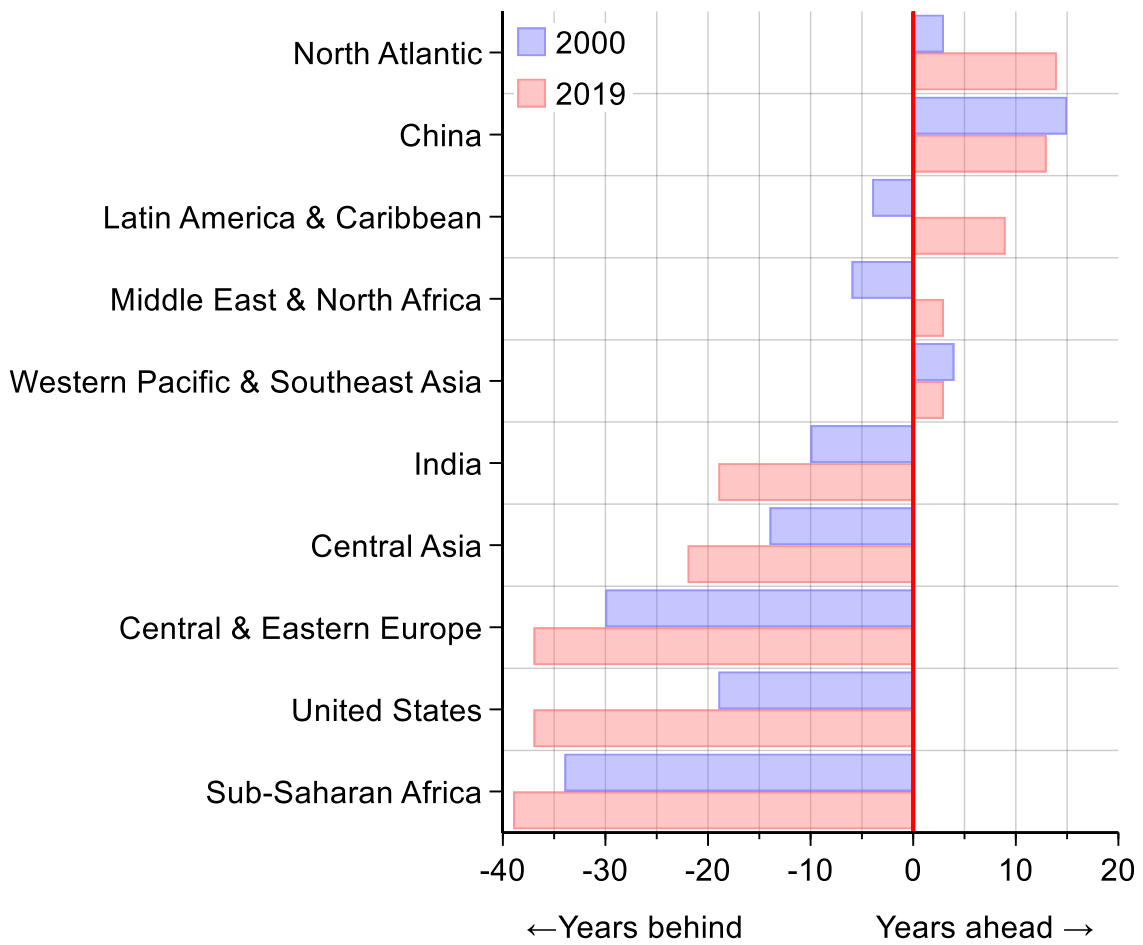
Notes: Probability of premature death (PPD) was defined as dying before age 70 years. Data source: UN WPP 2022.

Figure S8. Years behind or ahead of the Preston curve: 30 most populous countries



Notes: Probability of premature death (PPD) was defined as dying before age 70 years. Missing bars indicate being further behind than 1950 (the earliest available data). Data source: UN WPP 2022 and the Maddison Project 2023.

**Figure S9. Years behind or ahead relative to PPD predicted by current GDP:
Alternative specification of PPD-GDP relationship**



Notes: Probability of premature death (PPD) was defined as dying before age 70 years. See Sensitivity analyses section for details. Data source: UN WPP 2022 and the Maddison Project 2023.