



Analysis of Attained Height and Diabetes Among 554,122 Adults Across 25 Low- and Middle-Income Countries

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OBJECTIVE

The prevalence of type 2 diabetes is rising rapidly in low-income and middle-income countries (LMICs), but the factors driving this rapid increase are not well understood. Adult height, in particular shorter height, has been suggested to contribute to the pathophysiology and epidemiology of diabetes and may inform how adverse environmental conditions in early life affect diabetes risk. We therefore systematically analyzed the association of adult height and diabetes across LMICs, where such conditions are prominent.

RESEARCH DESIGN AND METHODS

We pooled individual-level data from nationally representative surveys in LMICs that included anthropometric measurements and diabetes biomarkers. We calculated odds ratios (ORs) for the relationship between attained adult height and diabetes using multilevel mixed-effects logistic regression models. We estimated ORs for the pooled sample, major world regions, and individual countries, in addition to stratifying all analyses by sex. We examined heterogeneity by individual-level characteristics.

RESULTS

Our sample included 554,122 individuals across 25 population-based surveys. Average height was 161.7 cm (95% CI 161.2–162.3), and the crude prevalence of diabetes was 7.5% (95% CI 6.9–8.2). We found no relationship between adult height and diabetes across LMICs globally or in most world regions. When stratifying our sample by country and sex, we found an inverse association between adult height and diabetes in 5% of analyses (2 out of 50). Results were robust to alternative model specifications.

CONCLUSIONS

Adult height is not associated with diabetes across LMICs. Environmental factors in early life reflected in attained adult height likely differ from those predisposing individuals for diabetes.

Noncommunicable diseases (NCDs), such as type 2 diabetes, are rapidly rising in low-income and middle-income countries (LMICs) (1,2), and there is an urgent need to understand factors driving this rise. To explore knowledge gaps that remain unexplained by more established risk factors (3), increasing attention has been paid to early life factors in chronic disease etiology (4). The underlying Developmental Origins

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of Health and Disease paradigm suggests that individuals exposed to adverse environmental influences, particularly malnutrition, in utero and in early childhood are predisposed to develop NCDs such as type 2 diabetes in adulthood (5). Possible mechanisms involved in the developmental programming of type 2 diabetes have been suggested to include structural and functional alterations affecting glucose metabolism, such as reduced β -cell mass and pancreatic insulin secretion (6).

Although adverse conditions in early life have commonly been assessed by body weight (7), they also translate into reduced attained adult height at the population level (8,9). Undernutrition in utero and in early life as well as repeated or chronic infections restrict individuals from reaching their full physical growth potential and may cause low birth weight, early childhood stunting, and, ultimately, shorter attained adult height (8,10). Height in high-income countries has been estimated to be $\sim 20\%$ environmentally determined (11). In low-resource settings, in which food scarcity and infectious diseases are more frequent and more severe, the environmentally determined component of height appears to be higher (11), and it has been suggested that adult height can be restricted by ≥ 10 –15 cm in the most extreme conditions (12). The extent to which variation in height among distinct populations is genetically determined is unclear. For example, in the U.S. and Europe, immigrants have tended to reach similar heights as those in the original populations within two generations, and advantaged groups in different populations tend to reach more similar

height than is observed between different social groups within populations (13,14).

Adult height relates to commonly accepted risk factors for diabetes, such as BMI, in a number of ways. First, BMI might underestimate diabetes risk in populations in whom adverse conditions in early life are common (5). In light of the Developmental Origins of Health and Disease paradigm, relatively small increases in adiposity during adulthood might increase diabetes risk if individuals have been exposed to detrimental conditions in early life (15). Second, adult height predicts mortality independent of adiposity (16), and the relationship of height and several NCDs has been widely scrutinized. Adult height, for instance, is related to lower cardiovascular risk, but higher cancer risk (5). Third, in contrast to BMI, adult height is largely determined by late adolescence and is therefore potentially less vulnerable to reverse causation bias compared with anthropometric indicators that are more volatile over time. This may particularly be the case in cross-sectional studies in which the time ordering between the exposure and outcome (diabetes) cannot be established clearly.

Evidence on the relationship between adult height and diabetes is limited (5), but appears to point to an inverse association, consistent with the Developmental Origins of Health and Disease paradigm (17,18). A recent systematic review and meta-analysis of 15 cross-sectional studies and 10 cohort studies concluded that shorter height is associated with increased risk of type 2 diabetes (18). Intensified screening and

prevention efforts in shorter individuals have been suggested (19), as well as the inclusion of height in the calculation of diabetes risk scores (20,21). Existing evidence on the relationship between adult height and diabetes, however, is limited to mostly heterogeneous studies focused on high-income settings (18). While the Developmental Origins of Health and Disease paradigm is not restricted to certain populations, its effects may be more pronounced in contexts in which adverse environmental factors, such as fetal and early childhood malnutrition, are highly prevalent (3). Further, in rapidly developing countries, individuals who face nutritional deficiencies in early life may be met with abundance at later stages, making a detrimental metabolic adaptation a likely risk factor for chronic diseases such as type 2 diabetes in these settings (22). In this study, we therefore pooled individual-level, nationally representative survey data from 25 LMICs ($N = 554,122$), including China and India. Our aim was to systematically assess the relationship between measured attained adult height and diabetes.

RESEARCH DESIGN AND METHODS

Data Sources

Prior to data acquisition, we defined several inclusion criteria for eligible surveys. Surveys were considered eligible if they: 1) were conducted later than 2004; 2) were nationally representative; 3) contained individual-level data; 4) had a response rate of at least 50%; 5) assessed anthropometric measurements and diabetes biomarkers; 6) took place in a country considered a low-, lower-middle-,

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or upper-middle-income country according to the World Bank classification in the year the survey was conducted; and, lastly, 7) contained information on the educational attainment and wealth status of respondents. As a first step, we identified 109 existing World Health Organization (WHO) STEPwise approach to Surveillance (STEPS) NCD risk factor surveys, of which 49 fulfilled our inclusion criteria and 16 could eventually be acquired and included in our data set (23). These included Benin, Bhutan, Comoros, Eswatini, Georgia, Guyana, Kenya, Lebanon, Liberia, Mongolia, Nepal, Saint Vincent and the Grenadines (SVG), Tanzania, Timor-Leste, Togo, and Uganda (Supplementary Fig. 1). As a second step, we systematically searched for applicable non-STEPS health surveys. We were able to identify 97 further surveys, of which 21 fulfilled the inclusion criteria and 7 could be finally obtained and included (see Supplementary Box 1 for search algorithm). These included La Encuesta Nacional de Salud y Nutrición (Ecuador), the Demographic and Health Surveys (Bangladesh, India, and Namibia), the Mexico Family Life Survey, the Study for the Evaluation of Prevalence of Hypertension and Cardiovascular Risk (Romania), and, lastly, the South African National Health and Nutrition Examination Survey. We also included the China Health and Nutrition Survey, which represents substantial variation in geography, health indicators, and economic development in China, and the Indonesian Family Life Survey, which represents 83% of the Indonesian population (Supplementary Fig. 2). Our final data set included 25 surveys collected between 2008 and 2016. Country-specific sampling methods and sources are reported for each survey in Supplementary Table 1. Briefly, 13 of the surveys (Bangladesh, Comoros, Eswatini, Georgia, Guyana, India, Mexico, Namibia, Romania, SVG, Timor-Leste, Togo, and Uganda) used a two-staged random sampling process, while other surveys included further stages in their sampling structure. Twelve of the surveys stratified their sample, typically by urban and rural areas (Bangladesh, Comoros, India, Indonesia, Mongolia, Namibia, Nepal, Romania, South Africa, SVG, Timor-Leste, and Uganda).

Study Population

We included participants 25 to 64 years of age, as most STEPS surveys limit their

biomarker assessment to this age range. We thus focus on type 2 diabetes and individuals who have not yet experienced a substantial loss in linear height due to aging (we examine alternative age criteria, however, in sensitivity analyses described below). We limited our analyses to participants with complete data on our exposure, outcome, and covariates. Average response rate, taking into account both household and individual response rates, was 88% across countries included in the study, yielding a final analytical sample of 554,122 individuals (Tables 1 and 2). Supplementary Fig. 3 displays a study participant flow diagram.

Measurement of Exposure and End Points

Our key exposure was attained adult height as a continuous variable in centimeters. For the WHO STEPS and Demographic and Health Surveys, which make up the majority of the surveys in our sample, adult height was typically measured once in a standing position using a portable height measuring board from Seca (24) or ShorrBoard (Weigh and Measure, LLC, Olney, MD) (25). Measurements were performed by trained staff following a detailed field manual. Individuals were defined as having diabetes based on WHO biomarker cutoffs: a fasting blood glucose of ≥ 7.0 mmol/L; a random blood glucose of ≥ 11.1 mmol/L; or an HbA_{1c} level of $\geq 6.5\%$ (26). Individuals with self-reported use of diabetes medication but normal biomarker values were also defined as having diabetes.

In 4 countries, glucose concentrations were measured in venous blood and in 18 countries in capillary blood, of which 12 were already provided as plasma equivalents. For the six remaining countries, we multiplied capillary glucose values by 1.11, based on prior evidence suggesting that plasma glucose levels are often underestimated by capillary glucose levels (27). Three countries exclusively measured HbA_{1c}. Individuals with missing information on fasting status were assumed to be fasting because they were instructed to fast as part of the study protocol for all countries, except in the case of India, where random blood glucose was measured.

Covariates

We included age (continuous), educational attainment (level attained at the

time of the survey), and a measure of household wealth (quintiles) as covariates to control for potential confounding in our analysis. We constructed a household wealth index based on four different measurements of household wealth (income categories, continuous income, income quintiles, or an asset index). The surveys used different methodologies for the computation of wealth indices. For surveys assessing various dwelling characteristics and household possessions, we created an asset index based upon a principal component analysis according to the standard approach of the Demographic and Health Surveys, from which we then derived unweighted wealth quintiles. Countries that assessed wealth by self-reported household income mostly adhered to the WHO STEPS standard questionnaire. Participants were asked about average household income per week, month, or year in the past year and, if the question remained unanswered, had the possibility to choose the most applicable of several precoded income ranges. In accordance with the procedure by Harttgen and Vollmer (28), we used both the precoded ranges and the continuous income levels to again create unweighted wealth quintiles, assuming that national incomes follow a log-normal distribution. Additional details are provided elsewhere (29). In descriptive statistics, BMI was grouped into thin (BMI < 18.5 kg/m²), lower-normal (BMI 18.5–19.9 kg/m²), normal (BMI 20.0–22.9 kg/m²), upper-normal (BMI 23.0–24.9 kg/m²), overweight (BMI 25–29.9 kg/m²), and obesity (BMI ≥ 30 kg/m²) (30).

Statistical Analyses

To determine the relationship between attained adult height and diabetes, we ran multilevel mixed-effects logistic regression models to obtain odds ratios (ORs) with 95% CIs, controlling for potential confounders. To account for the hierarchical structure of our data set, we included random intercepts for world region and country in pooled analyses. We adjusted SEs for clustering at the highest-level random intercept or at the primary sampling unit level when applicable. Two different multiple models were fitted. In model 1, we only included diabetes and height as variables. In model 2, our main model, we added age, education categories, and wealth quintiles.

Table 1—Study country characteristics by world region

Country	Survey year	Response rate, %	Sample size	Mean age, years (weighted)	Female, % (weighted)	Income group	Stunted, %	2015 Population, thousands
Latin America and the Caribbean								
Ecuador	2012	81.5	8,939	39.0	56.4	Upper-middle	25.4	16,144
Guyana	2016	66.7	552	41.7	52.2	Upper-middle	11.3	769
Mexico	2009–12	90.0	2,214	47.7	44.5	Upper-middle	13.6	125,891
SVG	2013	67.8	631	41.9	56.4	Upper-middle	—	109
Eastern Europe and the Middle East								
Georgia	2016	75.7	2,018	44.6	53.4	Lower-middle	11.3	3,952
Lebanon	2008–09	62.0	178	39.0	58.3	Upper-middle	16.5	5,851
Romania	2015–16	69.1	1,253	44.2	53.4	Upper-middle	12.8	19,877
South, East, and Southeast Asia								
Bangladesh	2011	95.0	5,922	46.7	51.1	Lower-middle	41.3	161,201
Bhutan	2014	96.9	2,240	39.1	41.5	Lower-middle	33.5	787
China	2009	88.1	6,198	47.3	53.3	Upper-middle	9.0	1,397,029
India	2015–16	96.0	490,532	37.0	46.6	Lower-middle	37.9	1,309,054
Indonesia	2014	83.0	4,283	42.2	51.3	Lower-middle	36.4	258,162
Mongolia	2009	95.0	1,111	39.6	45.2	Lower-middle	15.5	2,977
Nepal	2013	98.6	3,046	39.8	52.7	Low	37.5	28,656
Timor-Leste	2014	96.3	1,361	41.8	55.2	Lower-middle	50.9	1,241
Sub-Saharan Africa								
Benin	2008	99.0	3,228	43.5	50.5	Low	43.4	10,576
Comoros	2011	96.5	1,227	40.9	74.8	Low	31.1	777
Eswatini	2014	81.8	1,207	39.1	52.8	Lower-middle	25.5	1,319
Kenya	2015	95.0	3,121	38.2	50.3	Lower-middle	26.2	47,236
Liberia	2011	87.1	1,379	38.5	54.2	Low	41.8	4,500
Namibia	2013	96.9	3,200	46.8	60.2	Upper-middle	22.7	2,426
South Africa	2012	92.6	2,154	40.7	52.3	Upper-middle	27.2	55,291
Tanzania	2012	94.7	4,085	39.1	47.5	Low	37.1	53,880
Togo	2010	91.0	2,043	38.9	50.1	Low	27.6	7,417
Uganda	2014	99.0	2,000	39.1	54.2	Low	28.9	40,145
World (all data)	—	87.8	554,122	42.5	50.2	—	27.7	3,555,267

Mean age and percentage female calculated using sampling weights. The prevalence of early childhood stunting (Stunted, %) in the year closest to the survey was derived from the joint United Nations International Children's Fund/WHO/World Bank database. Stunting was defined as below -2 SDs from the median of the WHO 2006 reference population in terms of height-for-age. 2015 population size estimates were derived from the 2017 World Bank World Population Prospects.

We used equal weights for each country so that every country equally contributes to the analysis regardless of country sample size (we examine alternative country sampling weights in sensitivity analyses). We examined the relationship at the global level, by major world region and country, in addition to stratifying all analyses by sex. Descriptive statistics were calculated using sample weights.

Sensitivity Analyses

We subjected our regression results to a wide range of robustness checks. First, we added quadratic and cubic terms in age to account for possible nonlinearities in the relationship between age and diabetes. Second, we expanded our definition of diabetes to include individuals with self-reported diabetes diagnosis as

having diabetes. Third, although participants were instructed to fast, we excluded individuals who did not explicitly confirm their fasting status. Fourth, we modeled our outcome using a Poisson regression model to obtain risk ratios. Risk ratios are more intuitively interpretable and similar to ORs when the binary outcome is relatively uncommon. Fifth, we used alternative specifications of our outcome including a continuous outcome (blood glucose or HbA_{1c}), dysglycemia (fasting blood glucose of ≥ 5.6 mmol/L or HbA_{1c} level of $\geq 5.7\%$), and diabetes diagnostic categories in multinomial regression models (normal, pre-diabetes, and diabetes) (31). Sixth, we used an alternative specification of our sample (aged 20–70 years). Seventh, we converted our exposure for height into

a categorical variable (quartiles) instead of a continuous variable. Eighth, we weighted countries proportional to their population size. We also conducted a “leave-one-out analysis” by rerunning our pooled analyses but excluding India. Ninth, although data on covariates were missing for relatively few respondents (2.2%), we reran our main analyses after multiple imputation of missing variables in the data set. Tenth, we standardized height by conducting a z-transformation. We also used sex-specific WHO reference values for attained height at 19 years of age to externally standardize our exposure variable (32). Eleventh, we controlled for the diabetes ascertainment approach at the individual level to account for variation in diagnostic diabetes ascertainment (blood glucose, HbA_{1c}, or

Table 2—Selected characteristics of study participants

Characteristics	Overall		With diabetes		Without diabetes	
	Unweighted <i>N</i>	Weighted mean or percentage	Unweighted <i>n</i>	Weighted mean or percentage	Unweighted <i>n</i>	Weighted mean or percentage
Height	554,122	161.7	22,497	161.6	531,625	161.7
Age	554,122	41.5	22,497	47.6	531,625	41.0
Sex						
Male	99,698	47.3	5,711	47.44	93,987	47.26
Female	454,424	52.7	16,786	52.56	437,638	52.74
Education						
None	185,788	19.2	6,030	12.36	179,758	19.77
Primary	92,201	28.5	4,187	32.63	88,014	28.14
Secondary or more	276,133	52.3	12,280	55.01	263,853	52.09
Wealth quintile						
Poorest	103,555	19.3	2,596	17.30	100,959	19.46
Poorer	113,735	19.8	3,278	20.87	110,457	19.67
Middle	114,933	19.2	4,183	14.94	110,750	19.54
Richer	111,735	20.5	5,703	23.22	106,032	20.28
Richest	110,164	21.2	6,737	23.66	103,427	21.05
BMI (kg/m ²)						
Thin (<18.5)	82,623	7.14	1,483	2.93	81,140	7.48
Lower-normal (18.5–19.9)	70,803	8.53	1,351	3.65	69,452	8.93
Normal (20.0–22.9)	165,036	24.06	4,315	13.15	160,721	24.95
Upper-normal (23–24.9)	88,185	15.88	3,497	11.91	84,688	16.21
Overweight (25–29.9)	110,015	26.62	7,441	32.03	102,574	26.17
Obesity (≥30)	37,460	17.77	4,410	36.32	33,050	16.26

Mean or percentage use sample weights provided by the individual surveys and rescaled so that every country contributes equally.

both). Lastly, we added BMI (continuous) as a possible mediator in the relationship between adult height and diabetes.

Heterogeneity

We explored heterogeneity in the relationship between attained adult height and diabetes by key individual characteristics (educational attainment and birth cohort). The association between attained adult height and diabetes, for instance, may vary between individuals who are born during affluent, normal, or poor periods (10,13). In the absence of longitudinal or time-series data, we therefore stratified our analyses by birth cohort characteristics (infant mortality rate). We also stratified our analyses by changes in living standards over an individual's life course (4), using the absolute decrease in infant mortality rate between infancy and adulthood. In doing so, we hypothesized that those who experienced substantial changes in living standards over time may have been at particular increased risk of developing diabetes later in life, because the early life adaptive response to adversity may be detrimental when the nutritional environment improves drastically later on in life (22). Additional details on these analyses are presented in Supplementary Text 1 in the Supplementary Data.

Data Availability and Ethics

This study includes individual-level data with measured height and biomarkers for diabetes from 25 countries. Some of these data are publicly available, while other data are available by request to the country (e.g., the WHO STEPS surveys). We have arranged specific data use agreements for surveys that are not publicly accessible and are therefore unable to share these data given the terms of our agreements. Supplementary Table 1 provides a complete list of survey reports with country contacts through whom those data that are not publicly available may be requested. Stata version 15.1 was used for all statistical analyses. This study was approved by the Harvard T.H. Chan School of Public Health Institutional Review Board (Boston, MA).

RESULTS

Sample Description

Our final sample included 554,122 individuals across 25 LMICs. In our study population, attained adult height was on average 161.7 cm (95% CI 161.2–162.3). This estimate is ~8 cm shorter than the average in the U.S. (a substantial difference considering that height typically has an SD of ~7 cm) (33). Overall, crude

prevalence of diabetes in our sample was 7.5% (95% CI 6.9–8.2) (Table 2).

Association Between Adult Height and Diabetes in LMICs

Regression models using pooled individual-level data from 25 LMICs show that, contrary to expectations based on the Developmental Origins of Health and Disease paradigm (3) and prior evidence (17,18), the ORs of height and diabetes fluctuated closely around 1.0, mostly without reaching conventional benchmarks of statistical significance (Fig. 1 and Supplementary Table 2). As a notable exception, when stratifying our models by world region, we found that men in South, East, and Southeast Asia who were 1 cm taller had 3.1% higher odds (95% CI 0.6–5.6) of having diabetes (as opposed to lower as hypothesized). Results were consistent across a wide range of sensitivity analyses, including when using alternative specifications of our outcome, covariates, sample, and sample weights (Supplementary Figs. 4–18 and Supplementary Tables 3–6).

In Fig. 2, we show regression results for the relationship between attained adult height and diabetes using individual-level data stratified by country and sex. ORs were closely distributed around 1.0

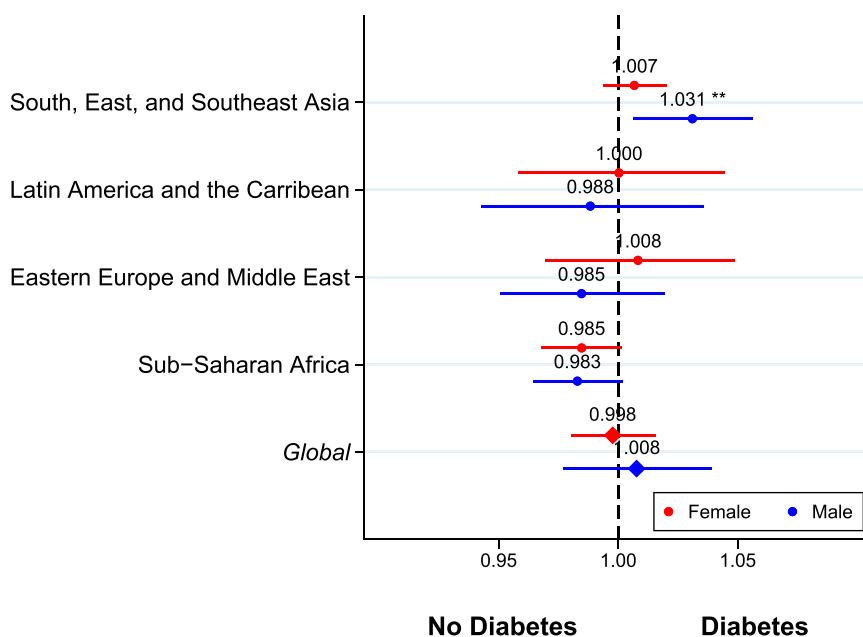


Figure 1—Global- and world region-sex-stratified ORs of height and diabetes. Figure shows adjusted ORs from multivariable mixed-effects logistic regression models in the pooled sample and by world region, separately for women (red) and men (blue). The outcome was diabetes based on measured biomarkers, and exposure was measured height in centimeters. The OR reflects the change in odds with every centimeter gain in height. Globally, the OR of having diabetes fluctuated closely around 1.0. All models controlled for age (years), education, and household wealth and included a random intercept for country. Additionally, in the pooled analysis, a random intercept for world region was included. Countries were weighted equally. Full regression output and sensitivity analyses, including using alternative specifications of the model, variables, sample, and sample weights, are presented in Supplementary Figs. 4–18 and Supplementary Tables 2–6. Error bars represent 95% CIs. $N = 554,122$. ** $P < 0.05$ (two-sided).

and did not reach statistical significance with a few exceptions. The previously reported inverse relationship between attained adult height and diabetes was found in 5% of analyses (2 out of 50). In Namibia, for instance, women who were 1 cm taller had 3.3% lower odds (95% CI 0.5–6.1) of having diabetes. We also identified positive associations between attained adult height and diabetes among women in China, Indonesia, and Timor-Leste, as well as among men in Tanzania and Timor-Leste. In Indonesia, for instance, women who were 1 cm taller had 4.5% higher odds (95% CI 2.5–6.6) of having diabetes.

Heterogeneity

In our main analyses, we examined the relationship between attained adult height and diabetes at the global level, by major world region, individual country, and sex. In Supplementary Figs. 19–21, we show results for heterogeneity in the relationship between adult height and diabetes by additional individual characteristics (educational attainment and birth cohort).

Consistent with our main findings, ORs for diabetes were generally closely distributed around 1.0. When stratifying our analyses by educational attainment, none of the coefficients on adult height reached conventional significance levels (Supplementary Fig. 19). When stratifying our analyses by birth cohort-level infant mortality rate, the relationship between adult height and diabetes appeared somewhat more pronounced among men who were born during periods with low infant mortality rates (as opposed to high mortality rates as hypothesized) (Supplementary Fig. 20).

CONCLUSIONS

Using nationally representative survey data from 554,122 individuals, we found little evidence for a relationship between measured attained adult height and diabetes across 25 LMICs globally or in most world regions. When stratifying our analysis by country and sex, we identified the previously described inverse association between adult height and diabetes in 5% of analyses. Our results were

consistent across a wide array of robustness checks, including when using alternative specifications of our model, exposure, outcome, analytical sample, and sample weights. Our findings suggest that adult height may play a more muted role in diabetes in LMICs than previously suggested by studies mostly focused on high-income country settings (17–20). To our knowledge, no other study has analyzed biomarker data on this scale to further our understanding of the link between attained adult height and diabetes in low-income and middle-income settings.

This study has several implications. First, our findings imply that the aspects of fetal and childhood nutrition influencing adult height likely differ from those predisposing individuals for adiposity and diabetes. Second, our findings point to a potential “decoupling” of risk factors for chronic undernutrition and diabetes, possibly resulting from the emergence of other different underlying drivers. Although undernutrition and obesity are both thought to be caused by poor-quality diets (such as low-quality calories) (34), their determinants are likely to be different if chronic undernutrition (as proxied by adult height) and diabetes were not associated. Third, as we found no relationship between height and diabetes in LMIC settings where adverse environmental conditions are highly prevalent, it appears unlikely that these conditions explain inverse associations observed in populations in high-income countries. The findings challenge prior evidence from more affluent settings, which has interpreted an inverse association between adult height and diabetes on the basis of the Developmental Origins of Health and Disease paradigm (17,18). Based on evidence from high-income countries, intensified screening and prevention efforts in shorter individuals have recently been suggested (19), as well as the inclusion of adult height in the calculation of diabetes risk scores (20,21). Policy makers in LMICs and funders of international development programs, however, should be aware of the lack of association between adult height and diabetes when designing policies aimed at reducing chronic disease in developing settings.

Despite our large-scale data collection effort to obtain both measured height and biomarker data on diabetes globally, this study has several limitations. First,

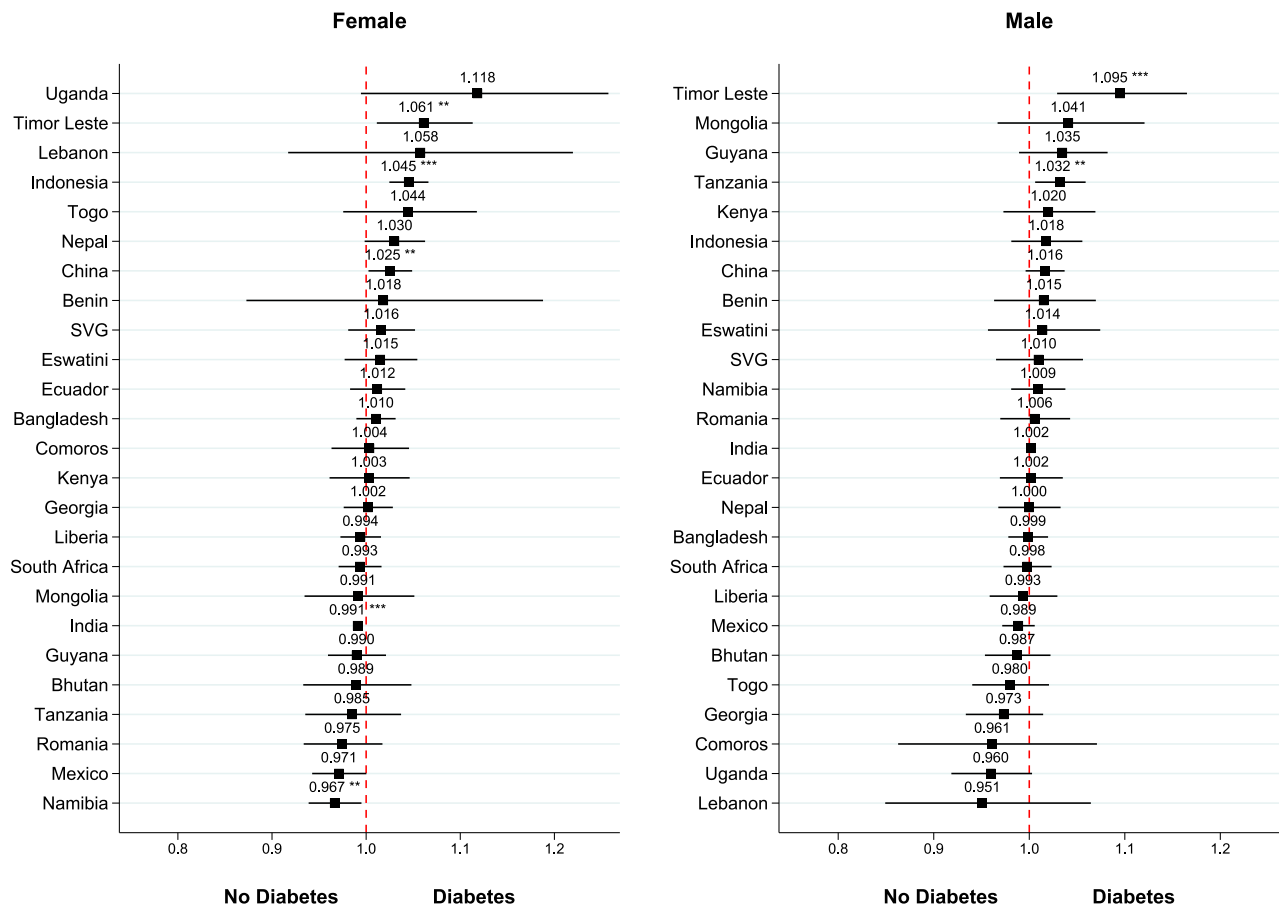


Figure 2—Country-sex-stratified ORs of height and diabetes. Figure shows adjusted ORs from multivariable logistic regression models by country, separately for women (left panel) and men (right panel). The outcome was diabetes based on measured biomarkers, and exposure was height measured in centimeters. The OR reflects the change in odds with every centimeter gain in height. The ORs of having diabetes at the sex-country level were closely distributed around 1.0. All models controlled for age (years), education, and household wealth. Sensitivity analyses, including using alternative specifications of the model, variables, sample, as well as sample weights, are presented in Supplementary Figs. 4–18 and Supplementary Tables 3–6. Error bars represent 95% CIs. $N = 554,122$. ** $P < 0.05$; *** $P < 0.01$ (two-sided).

although we controlled for known confounders, our study design does not allow testing for causal inference. Second, diabetes measurements may have yielded inaccuracies as biomarkers were generally measured only once, in capillary instead of venous blood, and fasting status was verified by self-report. Nonetheless, a key strength of our study was the availability of these individual-level biomarker data for diabetes as opposed to examining risk factors of diabetes as the primary outcome, such as BMI (35). Third, we were not able to distinguish between type 1 and type 2 diabetes. However, the incidence of type 1 diabetes is relatively low compared with type 2 diabetes, particularly in the age group >25 years of age (36). Fourth, our results may not generalize beyond the LMICs analyzed in the current study. Fifth, to interpret the association of attained adult height and diabetes in

the context of the Developmental Origins of Health and Disease paradigm, one must rely on the assumption that adult height is a plausible proxy for environmental conditions in early life, particularly malnutrition, at the population level (37). Adults, however, may be of shorter height for reasons unrelated to childhood living conditions (8). Individuals with exposure to childhood stunting and catch-up growth can also not be differentiated from individuals with normal growth. Nevertheless, there is only a narrow time frame in which complete catch-up growth is possible (38,39).

Furthermore, observed adult height may conceal other important consequences of adverse exposures in early life. Specifically, adversity in early life may affect observed adult height at the population level through two main channels: scarring and selective mortality. Scarring occurs when the entire distribution of height is shifted

downward due to an adverse exposure in early life (40). Selective mortality, in contrast, can bias downward, cancel out, or even dominate over the scarring effects, resulting in greater observed height in adulthood due to mortality being higher among children with underlying health problems. Selective mortality has been suggested to dominate over scarring when conditions are particularly harsh, such as in the Great Chinese famine and the Great Irish famine, as well as in a number of sub-Saharan African countries, such as Chad and Mali (13). Nevertheless, attained adult height has been shown to be a measure of cumulative net nutrition on a population level (8).

As a conclusion, adult height is not associated with diabetes across LMICs, in contrast to findings from high-income country settings. Environmental factors in early life reflected in attained adult height

likely differ from those predisposing individuals for diabetes.

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