

SHORT REPORT





# Genetic and environmental influences on adult human height across birth cohorts from 1886 to 1994

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Abstract Human height variation is determined by genetic and environmental factors, but it remains unclear whether their influences differ across birth-year cohorts. We conducted an individual-based pooled analysis of 40 twin cohorts including 143,390 complete twin pairs born 1886–1994. Although genetic variance showed a generally increasing trend across the birth-year cohorts, heritability estimates (0.69-0.84 in men and 0.53-0.78 in women) did not present any clear pattern of secular changes. Comparing geographic-cultural regions (Europe, North America and Australia, and East Asia), total height variance was greatest in North America and Australia and lowest in East Asia, but no clear pattern in the heritability estimates across the birth-year cohorts emerged. Our findings do not support the hypothesis that heritability of height is lower in populations with low living standards than in affluent populations, nor that heritability of height will increase within a population as living standards improve.

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# Introduction

Height is a classic anthropometric quantitative trait in humans due to its ease of measurement, approximately normal distribution and relative stability in adulthood. Since the studies of height in the late 19th and early 20th centuries (Galton, 1886; Pearson and Lee, 1903; Fisher, 1919), twin, adoption and family studies have shown that height is one of the most heritable human quantitative phenotypes (Silventoinen, 2003). More recently, genetic linkage studies have helped to elucidate the location of genetic effects in the genome (Perola et al., 2007) and genome-wide association (GWA) studies allowed identification of loci consistently associated with height in populations of different ancestry (Cho et al., 2009; Hao et al., 2013; Lango Allen et al., 2010; N'Diaye et al., 2011; Wood et al., 2014). Besides the genetic factors, a multitude of environmental factors, such as nutrition and childhood diseases, operate during the growth period and can affect the final attained height. These and other proximate biological determinants of height are further associated with social and economic conditions, which in turn are associated with living standards (Bozzoli et al., 2009; Bogin, 2001; Eveleth and Tanner, 1990; Steckel, 2009). The secular trend of increasing height over the 20<sup>th</sup> century observed in many parts of the world, which has slowed or stopped in most northern European countries, probably reflects the continuous improvement in the standard of living (Eveleth and Tanner, 1990; Cole, 2003; Stulp and Barrett, 2016). A recent study showed that the height difference between the tallest and shortest populations a century ago (19–20 cm) has remained the same for women and increased for men (NCD Risk Factor Collaboration (NCD-RisC), 2016).

Twin and family studies have consistently estimated that the proportion of variation in adult height explained by genetic differences between individuals, or heritability, in general populations is approximately 0.80 (Fisher, 1919; Silventoinen et al., 2003; Stunkard et al., 1986). There is a hypothesis that heritability is not constant and can differ in environments having different amount of environmental variation. Accordingly, it has been suggested that heritability of height is lower in populations with low living standards compared with affluent populations since poverty can lead to a lack of basic necessities important for human growth in part of the population (Steckel, 2009). However, there is little direct evidence on this issue. A study in Finnish twins born between 1900 and 1957 showed that the heritability of height increased across birth cohorts born in the first half of the century when the standard of living increased and leveled off after World War II thus supporting this hypothesis (Silventoinen et al., 2000). Because this result needs to be replicated, we conducted an individual-based analysis of 40 twin cohorts from 20 countries. We aimed to analyze (i) the genetic and environmental contribution to the variation of adult height across nine birth-year cohorts covering more than 100 years and (ii) to assess whether the pattern varies by geographic-cultural region (Europe, North America and Australia, and East Asia).

### Results

In the pooled data (all twin cohorts together), mean height was greater in men than in women and increased over the birth-year cohorts in both sexes; the decrease ( > 1 cm) observed in the latest birth cohort mainly reflects differences in the distribution of different twin cohorts within each group (*Table 1*). Both means and variances were significantly different between twin cohorts in all birth-year and sex groups. Mean height was shorter in East Asia than in Europe and North America and Australia in all birth-year and sex groups. The increase in mean height over the birth cohorts (from 1940–1949 to 1980–1994) was substantially greater in East Asia than in the other two geographic-cultural regions. The variance of height was generally greater in men than in women, lowest in East Asia and greatest in North America and Australia, and showed a general trend to increase over the birth cohorts.

The variance of adult height explained by additive genetic, shared environmental and unique environmental factors by birth-year cohorts is presented in *Figure 1* (estimates with 95% confidence intervals (CIs) are available in *Supplementary file 1A*). In men, there was a trend for an increasing total variance from birth cohort 1940–1949 onwards; genetic variance also increased during this period but especially in the two latest birth-year cohorts (1970–1979 and 1980–1994). Height variance due to the environment shared by co-twins was significant from birth cohorts 1920–1929 to 1970–1979, being greatest from 1950 to 1969. The effect of environmental factors unique to each



**Table 1.** Descriptive statistics of age and height by sex, birth year and geographic-cultural region. Names list of the participating twin cohorts in this study: two cohorts from Australia (Australian Twin Registry and Queensland Twin Register), six cohorts from East-Asia (Korean Twin-Family Register, Mongolian Twin Registry, Osaka University Aged Twin Registry, South Korea Twin Registry, Qingdao Twin Registry of Adults and West Japan Twins and Higher Order Multiple Births Registry), 18 cohorts from Europe (Adult Netherlands Twin Registry, Berlin Twin Register, Bielefeld Longitudinal Study of Adult Twins, Danish Twin Cohort, East Flanders Prospective Twin Survey, Finnish Older Twin Cohort, FinnTwin12, FinnTwin16, Genesis 12–19 Study, Hungarian Twin Registry, Italian Twin Registry, Murcia Twin Registry, Norwegian Twin Registry, Swedish Twin Cohorts, Swedish Young Male Twins Study of Adults, TCHAD-study, TwinsuK and Young Netherlands Twin Registry), two cohorts from South-Asia and Middle-East (Sri Lanka Twin Registry and Turkish Twin Study) and 12 cohorts from North-America (California Twin Program, Carolina African American Twin Study of Aging, Colorado Twin Registry, Michigan State University Twin Registry, Mid Atlantic Twin Registry, Minnesota Twin Registry, NAS-NRC Twin Registry, SRI-international, University of British Columbia Twin Project, University of Southern California Twin Study, University of Washington Twin Registry and Vietnam Era Twin Study of Aging).

Age		Height												
All cohorts		All cohorts		Europe		NA and Australia			East Asia					
Mean	SD	Range	Ν	Mean (F, p-value)*	SD (F, p-value) <sup>†</sup>	N	Mean	SD	Ν	Mean	SD	Ν	Mean	SD
67.0	7.5	53.5–99.2	3747	171.6 (15, < 0.001)	6.34 (2.5,0.019)	3569	171.5	6.27	178	174.6	6.88			
52.2	16.2	20.0–95.8	9171	174.2 (23, < 0.001)	6.72 (5.0,<0.001)	4117	173.3	6.37	5052	174.9	6.91			
51.6	16.1	20.0–90.9	23147	175.4 (62, < 0.001)	6.81 (5.7,<0.001)	6382	173.9	6.42	16714	176.0	6.82			
57.5	10.5	33.5–83.2	12028	175.7 (413, < 0.001)	6.70 (2.9,<0.001)	9308	175.2	6.42	2658	178.1	6.78			
49.3	10.6	23.5–73.9	22967	177.4 (72, < 0.001)	6.73 (2.5,<0.001)	16629	177.0	6.53	6235	178.4	6.95	68	164.8	6.57
41.4	10.0	19.5–65.0	24560	178.4 (120, < 0.001)	6.96 (6.5,<0.001)	15199	178.5	6.73	9124	178.7	7.04	161	167.1	4.79
35.5	7.1	19.5–54.0	13264	179.0 (99, < 0.001)	7.49 (2.3,<0.001)	6218	179.6	7.04	6574	179.2	7.22	298	168.1	6.24
28.7	5.4	19.5–44.0	14975	179.9 (121, < 0.001)	7.55 (5.5,<0.001)	10339	180.7	7.01	3906	179.7	7.51	456	170.1	5.68
23.1	3.2	19.5–34.4	9948	178.4 (70, < 0.001)	7.59 (4.9,<0.001)	5077	178.8	7.22	4066	179.4	7.49	329	173.1	6.37
68.5	8.1	53.5–98.0	5423	160.2 (23, < 0.001)	6.14 (3.3,0.006)	5011	160.2	6.11	412	160.2	6.41			
62.0	10.9	43.6–95.9	7169	161.1 (18, < 0.001)	5.93 (2.5,0.002)	5621	161.0	5.85	1548	161.2	6.20			
59.7	11.4	37.5–91.7	10975	162.1 (65, < 0.001)	5.99 (3.8,<0.001)	7908	162.0	5.89	3052	162.4	6.16			
57.9	10.0	33.5–83.0	14610	162.7 (249, < 0.001)	6.05 (5.8,<0.001)	11226	162.5	5.83	3344	163.2	6.49			
49.9	10.2	23.5–74.0	28537	163.7 (175, < 0.001)	6.19 (10.3,<0.001)	20097	163.9	5.93	8285	163.5	6.57	100	153.6	5.33
41.3	9.5	19.5–64.0	31250	164.4 (146, < 0.001)	6.58 (13.6,<0.001)	18817	164.8	6.22	12080	164.1	6.78	225	155.1	5.10
35.8	6.9	19.5–54.3	20422	165.1 (163, < 0.001)	7.00 (8.6,<0.001)	9604	166.2	6.58	10182	164.6	6.87	438	156.8	5.17
29.3	5.4	19.5–44.3	19893	165.9 (180, < 0.001)	7.27 (11.5,<0.001)	11819	167.3	6.67	7034	165.0	7.22	718	158.5	5.58
23.4	3.3	19.5–34.3	14694	164.7 (118, < 0.001)	7.07 (6.2,<0.001)	7291	165.6	6.77	6274	164.9	6.96	633	159.8	5.74
	All col	All colors   All c	All cob-rts  Mean SD Range  67.0 7.5 53.5-99.2  52.2 16.2 20.0-95.8  51.6 16.1 20.0-90.9  57.5 10.5 33.5-83.2  49.3 10.6 23.5-73.9  41.4 10.0 19.5-65.0  35.5 7.1 19.5-54.0  28.7 5.4 19.5-44.0  23.1 3.2 19.5-34.4  68.5 8.1 53.5-98.0  62.0 10.9 43.6-95.9  59.7 11.4 37.5-91.7  57.9 10.0 33.5-83.0  49.9 10.2 23.5-74.0  41.3 9.5 19.5-64.0  35.8 6.9 19.5-54.3  29.3 5.4 19.5-44.3	All cohons SD Range N  67.0 7.5 53.5–99.2 3747  52.2 16.2 20.0–95.8 9171  51.6 16.1 20.0–90.9 23147  57.5 10.5 33.5–83.2 12028  49.3 10.6 23.5–73.9 22967  41.4 10.0 19.5–65.0 24560  35.5 7.1 19.5–54.0 13264  28.7 5.4 19.5–44.0 14975  23.1 3.2 19.5–34.4 9948  68.5 8.1 53.5–98.0 5423  62.0 10.9 43.6–95.9 7169  59.7 11.4 37.5–91.7 10975  57.9 10.0 33.5–83.0 14610  49.9 10.2 23.5–74.0 28537  41.3 9.5 19.5–64.0 31250  35.8 6.9 19.5–54.3 20422  29.3 5.4 19.5–44.3 19893	All coborts           Mean         SD         Range         N         Mean (F, p-value)*           67.0         7.5         53.5–99.2         3747         171.6 (15, < 0.001)	All cohorts  Mean SD Range N Mean (F, p-value)* SD (F, p-value)†  67.0 7.5 53.5–99.2 3747 171.6 (15, < 0.001) 6.34 (2.5,0.019)  52.2 16.2 20.0–95.8 9171 174.2 (23, < 0.001) 6.72 (5.0, < 0.001)  51.6 16.1 20.0–90.9 23147 175.4 (62, < 0.001) 6.70 (2.9, < 0.001)  57.5 10.5 33.5–83.2 12028 175.7 (413, < 0.001) 6.70 (2.9, < 0.001)  49.3 10.6 23.5–73.9 22967 177.4 (72, < 0.001) 6.73 (2.5, < 0.001)  41.4 10.0 19.5–65.0 24560 178.4 (120, < 0.001) 6.96 (6.5, < 0.001)  35.5 7.1 19.5–54.0 13264 179.0 (99, < 0.001) 7.49 (2.3, < 0.001)  28.7 5.4 19.5–34.4 9948 178.4 (70, < 0.001) 7.55 (5.5, < 0.001)  23.1 3.2 19.5–34.4 9948 178.4 (70, < 0.001) 7.59 (4.9, < 0.001)  68.5 8.1 53.5–98.0 5423 160.2 (23, < 0.001) 7.59 (4.9, < 0.001)  68.5 8.1 37.5–91.7 10975 162.1 (65, < 0.001) 5.99 (3.8, < 0.001)  57.9 10.0 33.5–83.0 14610 162.7 (249, < 0.001) 6.05 (5.8, < 0.001)  49.9 10.2 23.5–74.0 28537 163.7 (175, < 0.001) 6.58 (13.6, < 0.001)  35.8 6.9 19.5–54.3 20422 165.1 (163, < 0.001) 7.00 (8.6, < 0.001)  35.8 6.9 19.5–54.3 19893 165.9 (180, < 0.001) 7.27 (11.5, < 0.001)	All cohorts  All cohorts  All cohorts  SD Range  N Mean (F, p-value)* SD (F, p-value)† N  67.0 7.5 53.5–99.2 3747 171.6 (15, < 0.001) 6.34 (2.5,0.019) 3569  52.2 16.2 20.0–95.8 9171 174.2 (23, < 0.001) 6.72 (5.0, < 0.001) 4117  51.6 16.1 20.0–90.9 23147 175.4 (62, < 0.001) 6.70 (2.9, < 0.001) 9308  49.3 10.6 23.5–73.9 22967 177.4 (72, < 0.001) 6.73 (2.5, < 0.001) 16629  41.4 10.0 19.5–65.0 24560 178.4 (120, < 0.001) 6.96 (6.5, < 0.001) 15199  35.5 7.1 19.5–54.0 13264 179.0 (99, < 0.001) 7.49 (2.3, < 0.001) 6218  28.7 5.4 19.5–44.0 14975 179.9 (121, < 0.001) 7.55 (5.5, < 0.001) 10339  23.1 3.2 19.5–34.4 9948 178.4 (70, < 0.001) 7.59 (4.9, < 0.001) 5077  68.5 8.1 53.5–98.0 5423 160.2 (23, < 0.001) 5.93 (2.5, 0.002) 5621  59.7 11.4 37.5–91.7 10975 162.1 (65, < 0.001) 5.99 (3.8, < 0.001) 7908  57.9 10.0 33.5–83.0 14610 162.7 (249, < 0.001) 6.79 (10.3, < 0.001) 11226  49.9 10.2 23.5–74.0 28537 163.7 (175, < 0.001) 6.70 (8.6, < 0.001) 18817  35.8 6.9 19.5–54.3 20422 165.1 (163, < 0.001) 7.00 (8.6, < 0.001) 9604  29.3 5.4 19.5–44.3 1989 165.9 (180, < 0.001) 7.27 (11.5, < 0.001) 11819	All colority         Europet           Mean         SD         Range         N         Mean (F, p-value)*         SD (F, p-value)†         N         Mean           67.0         7.5         53.5–99.2         3747         171.6 (15, < 0.001)	All colspan="4">Europe           Mean         SD         Range         N         Mean (F, p-value)*         SD (F, p-value)*         N         Mean         SD           67.0         7.5         53.5-99.2         3747         171.6 (15, < 0.001)	All cohorts         Europe         NA and Mean (R, p-value)*           Mean         SD         Range         N         Mean (F, p-value)*         SD (F, p-value)†         N         Mean         SD         N           67.0         7.5         53.5–99.2         3747         171.6 (15, < 0.001)	All colors	All colors         Europer         NA and Australian           Mean         SD         Range         N         Mean (F, p-value)*         SD (F, p-value)*         N         Mean         SD         N         Mean         SD           67.0         7.5         53.5-99.2         3747         171.6 (15, < 0.001)	All colors	All colors   Sure   Sure

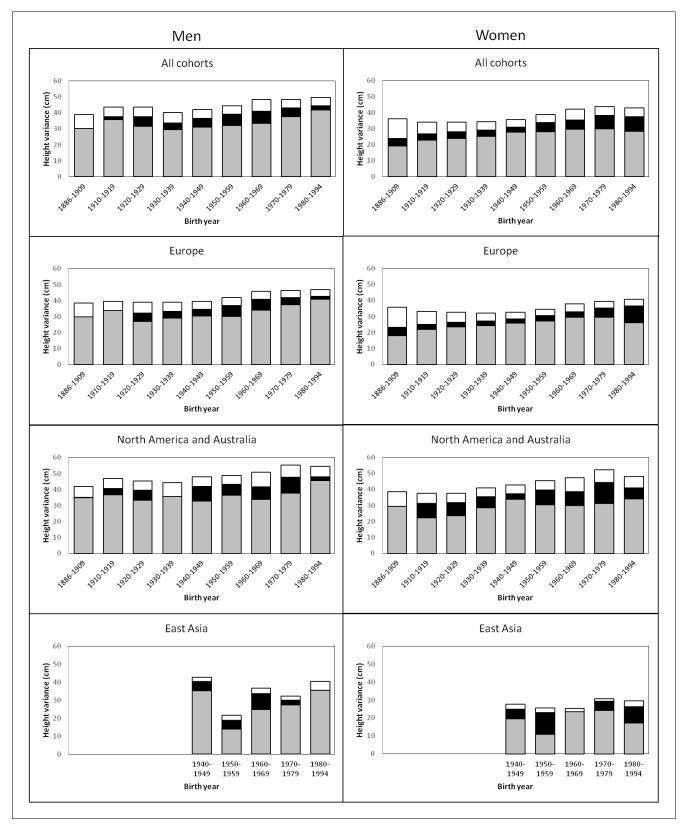
<sup>\*</sup>Welch ANOVA test for equality of means

<sup>†</sup>Levene's test for equality of variances; SD: standard deviation

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twin individual including measurement error was more similar across birth-year cohorts. Heritability estimates ranged from 0.69 to 0.84 and were greatest in the two earliest and the two latest birth-year cohorts (*Table 2*). In women, although the total variance also started to increase from birth cohort 1940–1949, genetic variance showed an increasing trend from the earliest birth-year cohort. Both shared and unique environmental factors explained variation in height in all analyzed birth-year cohorts; whereas the shared environmental variance was somewhat greater in the latest cohorts (1970–1979 and 1980–1994) unique environmental variance was greatest in the earliest one. Although the variance components differed between sexes in all birth-year cohorts, the relative contribution of the genetic and environmental variance components did not differ by sex from 1930–1939 to 1960–1969 (*Supplementary file1B*). In contrast to the results in men, heritability estimates in women (0.53 to 0.78) were lowest in the earliest and latest cohorts, particularly in 1886–1909.





**Figure 1.** Additive genetic (grey), shared environmental (black) and unique environmental (white) variances of height across birth-year cohorts for the pooled data and by geographic-cultural region.

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**Table 2.** Proportion of the height variance explained by additive genetic, shared environmental and unique environmental factors by birth year, sex and geographic-cultural region.

	Men			Women			
	Additive genetics	Shared environment	Unique environment	Additive genetics	Shared environment	Unique environment	
Birth year	A 95% Cls	C 95% Cls	E 95% Cls	A 95% Cls	C 95% Cls	E 95% Cls	
All cohorts							
1886–1909	0.78 0.69 0.80	0.00 0.00 0.08	0.22 0.20 0.25	0.53 0.43 0.6	2 0.13 0.05 0.21	0.34 0.31 0.37	
1910–1919	0.82 0.76 0.87	0.04 0.00 0.10	0.14 0.13 0.15	0.67 0.60 0.7	4 0.11 0.04 0.18	0.22 0.20 0.24	
1920–1929	0.72 0.69 0.76	0.14 0.10 0.17	0.14 0.13 0.15	0.70 0.64 0.7	6 0.12 0.07 0.18	0.18 0.17 0.19	
1930–1939	0.73 0.68 0.79	0.10 0.04 0.16	0.16 0.15 0.18	0.74 0.68 0.79	9 0.11 0.06 0.16	0.15 0.14 0.16	
1940–1949	0.74 0.70 0.78	0.13 0.09 0.17	0.13 0.12 0.13	0.78 0.75 0.8	2 0.09 0.05 0.13	0.13 0.12 0.13	
1950–1959	0.72 0.69 0.76	0.16 0.12 0.20	0.12 0.11 0.12	0.73 0.69 0.7	6 0.15 0.11 0.18	0.12 0.12 0.13	
1960–1969	0.69 0.63 0.76	0.16 0.09 0.21	0.15 0.14 0.16	0.70 0.66 0.7	5 0.14 0.09 0.18	0.16 0.15 0.17	
1970–1979	0.77 0.72 0.83	0.11 0.06 0.17	0.11 0.10 0.12	0.68 0.64 0.7	3 0.19 0.14 0.23	0.13 0.12 0.13	
1980–1994	0.84 0.77 0.90	0.05 0.00 0.13	0.11 0.10 0.12	0.66 0.61 0.7	2 0.21 0.16 0.27	0.13 0.12 0.13	
Europe							
1886–1909	0.78 0.69 0.80	0.00 0.00 0.08	0.22 0.20 0.25	0.50 0.40 0.6	0 0.14 0.06 0.23	0.35 0.32 0.39	
1910–1919	0.85 0.79 0.87	0.00 0.00 0.07	0.15 0.13 0.16	0.66 0.58 0.74	4 0.10 0.02 0.17	0.24 0.22 0.26	
1920–1929	0.69 0.62 0.76	0.14 0.07 0.20	0.17 0.16 0.19	0.72 0.65 0.7	9 0.09 0.03 0.16	0.19 0.17 0.21	
1930–1939	0.75 0.69 0.81	0.11 0.05 0.17	0.14 0.13 0.16	0.76 0.70 0.8	2 0.09 0.03 0.14	0.16 0.15 0.17	
1940–1949	0.77 0.72 0.82	0.10 0.06 0.15	0.13 0.12 0.13	0.79 0.75 0.8	3 0.08 0.04 0.13	0.13 0.12 0.13	
1950–1959	0.72 0.68 0.77	0.16 0.11 0.20	0.12 0.11 0.12	0.79 0.75 0.8	3 0.09 0.05 0.13	0.12 0.11 0.13	
1960–1969	0.74 0.66 0.83	0.15 0.06 0.23	0.11 0.10 0.12	0.78 0.72 0.8	5 0.08 0.02 0.15	0.13 0.12 0.14	
1970–1979	0.81 0.74 0.88	0.09 0.02 0.16	0.10 0.09 0.10	0.74 0.69 0.8	1 0.15 0.09 0.21	0.11 0.10 0.11	
1980–1994	0.87 0.77 0.92	0.04 0.00 0.14	0.09 0.08 0.10	0.64 0.57 0.7	2 0.26 0.18 0.32	0.10 0.09 0.11	
North America and Austra	llia						
1886–1909	0.83 0.33 0.90	0.01 0.00 0.49	0.16 0.10 0.26	0.76 0.43 0.8	2 0.00 0.00 0.31	0.24 0.18 0.32	
1910–1919	0.78 0.70 0.87	0.09 0.00 0.17	0.13 0.12 0.15	0.60 0.44 0.7	8 0.24 0.06 0.39	0.16 0.14 0.19	
1920–1929	0.73 0.69 0.77	0.14 0.10 0.18	0.13 0.12 0.14	0.63 0.52 0.7	6 0.22 0.09 0.33	0.15 0.14 0.17	
1930–1939	0.81 0.66 0.83	0.00 0.00 0.14	0.19 0.17 0.22	0.70 0.59 0.8	2 0.17 0.04 0.28	0.13 0.12 0.15	
1940–1949	0.69 0.61 0.77	0.19 0.10 0.27	0.13 0.12 0.14	0.80 0.72 0.8	7 0.08 0.00 0.15	0.13 0.12 0.14	
1950–1959	0.75 0.68 0.82	0.14 0.07 0.21	0.11 0.10 0.12	0.67 0.61 0.7	3 0.21 0.15 0.26	0.13 0.12 0.13	
1960–1969	0.66 0.58 0.76	0.16 0.06 0.24	0.18 0.17 0.20	0.63 0.57 0.79	0 0.18 0.11 0.24	0.18 0.17 0.20	
1970–1979	0.68 0.57 0.81	0.18 0.05 0.29	0.14 0.13 0.16	0.60 0.53 0.6	7 0.25 0.18 0.32	0.15 0.14 0.16	
1980–1994	0.83 0.72 0.89	0.04 0.00 0.16	0.12 0.11 0.14	0.71 0.62 0.8	1 0.14 0.04 0.23	0.15 0.14 0.16	
East Asia							
1940–1949	0.83 0.33 0.97	0.12 0.00 0.61	0.05 0.03 0.12	0.71 0.17 0.9	4 0.19 0.00 0.73	0.10 0.06 0.18	
1950–1959	0.64 0.24 0.91	0.23 0.00 0.63	0.13 0.08 0.20	0.42 0.14 0.9	2 0.48 0.00 0.75	0.10 0.07 0.15	
1960–1969	0.67 0.36 0.94	0.24 0.00 0.56	0.08 0.06 0.12	0.92 0.67 0.94	4 0.00 0.00 0.25	0.08 0.06 0.10	
1970–1979	0.85 0.51 0.95		0.07 0.05 0.09	0.79 0.52 0.9	6 0.17 0.00 0.43	0.05 0.04 0.06	

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When we studied the effect of birth year on the genetic variance by using gene-environment interaction models, modest but statistically significant increase was found. The interaction effect was 0.050 (95% CI 0.018–0.082) in men and 0.043 (95% CI 0.019–0.071) in women for the genetic path coefficient per 10 years. This turns to 1.37 (95% CI 0.50–2.27) increase of genetic variance in men and 1.07 (95% CI 0.46–1.79) increase of genetic variance in women per 25 years, i.e. approximately one human generation.

Univariate quantitative genetic models for height were then conducted separately in the three geographic-cultural regions (*Figure 1* and *Supplementary file 1A*). The pattern in Europe was practically the same as that observed for the pooled data because it represents a large proportion of the total sample. In North America and Australia, the total variance of height was greater than in Europe, but the pattern of genetic and environmental variances was less consistent across birth-year cohorts. In East Asia, because of the smaller sample size, the magnitude of the variance components between the birth-year cohorts fluctuated more than in the other two geographic-cultural regions. Genetic variance was generally greater in men than in women in the three geographic-cultural regions. Variance components of height (both raw and relative proportion) showed a similar pattern across birth-year cohorts when analyses were performed for men and women together (*Supplementary file 1C*).

### **Discussion**

This very large twin study showed no clear pattern in the heritability of height across birth-year cohorts and thus does not support the hypothesis that the heritability of height is lower in populations with low living standards compared with affluent populations, nor that the heritability of height will increase within a population as living standards improve. Since infant mortality rates are higher in men than in women, both in singletons (Drevenstedt et al., 2008) and twins (Pongou, 2013), the higher heritability observed for men in the earliest cohorts could be explained by selection effects since those who survived were the genetically more advantaged and thus less vulnerable to environmental conditions. The greater relative environmental effect on height variation in women than in men, although unexpected because women's growth is considered to be more resistant to environmental influences, is in agreement with the findings in Finnish twins born prior to 1958 (Silventoinen et al., 2000). This might indicate differential access to food and medical care (Eveleth and Tanner, 1990). Women are also more likely to develop osteoporosis leading to shrinking in old age (National Institute of Arthritis and musculoskeletal and Skin Diseases, 2014), which may affect the greater influence of unique environmental factors in women born in 1886-1910. This idea is supported by results showing that although genetic factors play an important role in bone loss in early postmenopausal women, their effect weakens with age and completely disappears with advanced aging (Moayyeri et al., 2012).

Total and genetic variance of height generally increased across birth-year cohorts; gene-birth year interaction analysis showed that the genetic variance increase was only modest even when it was statistically significant in this very large twin cohort. However, part of the increase in total variance in some birth-year cohorts was also due to the increase in shared environmental variance. This suggests that both greater ethnic diversity and variation in living standards have contributed to the secular increase in height variation. The greatest total height variation in North America and Australia was due to both genetic and environmental factors and the pattern of variance components across the birth cohorts was less consistent than in Europe. A recent study across 14 European countries found that many independent loci contribute to population genetic differences in height and estimated that these differences account for 24% of the captured additive genetic variance (Robinson et al., 2015). Therefore, it may be that both allelic frequencies and the effects of genes affecting height vary between the geographic-cultural regions. It has been previously shown that even when the total variance of height was greater in Western populations than in East Asian populations, heritability estimates were largely similar in adolescence (Hur et al., 2008) and from 1 to 19 years of age (Jelenkovic et al., 2016); however, the limited statistical power in the data from East Asia does not allow for comparisons across birth cohorts.

The main strength of the present study is the very large sample size of our multinational database of twin cohorts, with adult height data from individuals born between year 1886 and 1994, allowing a more detailed investigation of the genetic and environmental contributions to individual



differences in height across birth cohorts than in the previous studies. Important advantages of individual-based data are improved opportunities for statistical modeling and lack of publication bias. This type of analysis is difficult to perform by using literature-based meta-analyses because most of the published studies do not provide the needed statistics by birth-year cohorts. However, our study also has limitations. Countries and/or ethnic-cultural regions are not equally represented and the database is heavily weighted toward populations following Westernized lifestyles. In the classical twin design, parental phenotypic assortment increases dizygotic correlations and thus inflates the shared environmental component when not accounted for in the modeling. In our database, we do not have information on parental height and thus could not take into account assortative mating, which may thus explain part of the shared environmental variation. In addition, most of the height measures were self-reported (Silventoinen et al., 2015), which may bias our analyses toward higher estimates of unique environmental effects due to increased measurement error. However, these sources of bias are unlikely to explain our main result, i.e., relatively similar heritability estimates of adult height over birth cohorts. Finally, since we previously showed that there was no zygosity difference in height variance (Jelenkovic et al., 2015), variance components estimates should not be affected by changes in the proportion of MZ to DZ twins across birth-year cohorts.

In conclusion, although the genetic variance of height showed a slightly increasing trend with birth year, heritability estimates did not present any clear pattern of secular changes across birth-year cohorts from 1886 to 1994. Thus, our findings do not support the hypothesis that the heritability of height increases along with increasing living standards and diminishing rate of absolute poverty within populations.

### Materials and methods

# Sample

This study is based on the data from the Collaborative project of Development of Anthropometrical measures in Twins (CODATwins), which was intended to pool data from all twin projects in the world with information on height and weight measurements for MZ and DZ twins (*Silventoinen et al.*, 2015). For the present analyses, we selected height measurements at ages 19.5–99.5 years. After excluding four cohorts having less than 50 twin individuals in the final database, we had data from 40 cohorts in 20 countries. The participating twin cohorts are identified in *Table 1* (footnote) and were previously described in detail (*Silventoinen et al.*, 2015).

From the initial 558,672 height measurements, we excluded those <145 or>210 cm in men and <135 or >195 cm in women (<0.1% of the measurements). Since individuals in longitudinal studies have more than one measurement over time, analyses were restricted to one observation per individual resulting in 323,491 individuals. After excluding unmatched pairs (without data on their co-twins), we had 286,780 twin individuals (143,390 complete twin pairs) born between year 1886 and 1994 (40% monozygotic (MZ), 41% same- sex dizygotic (SSDZ) and 19% opposite-sex dizygotic (OSDZ) twin pairs). The smaller proportion of OSDZ compared to SSDZ twins in this study is explained by the fact that some of the twin cohorts in our database have collected, by design, only SSDZ twins and thus do not have data on OSDZ twins. These individuals were categorized into nine consecutive birth year groups described in *Table 1*. In order to analyze possible ethnic-cultural differences in the genetic and environmental contribution on height, cohorts were grouped in three geographical-cultural regions: Europe (18 cohorts), North America and Australia (14 cohorts) and East Asia (six cohorts) with 87,116, 53,359 and 1793 twin pairs, respectively. One cohort from the Middle-East and the one from South-Asia were not included in these sub-analyses by geographic-cultural region because the data were too sparse to study these two areas separately.

### Statistical analyses

We first tested whether the means and variances of height differed between twin cohorts within each sex and birth-year group (*Table 1*). Since the Levene's test for homogeneity indicated that variances were not homogeneous, a Welch's ANOVA was performed showing that means were significantly different between twin cohorts in all sex and birth-year groups.

To analyze genetic and environmental influences on the variation of height, we used classic twin modeling based on linear structural equations (Neale and Cardon, 1992). MZ twins share the same



genomic sequence, whereas DZ twins share, on average, 50% of their genes identical-by-descent. On this basis, it is possible to divide the total variance of height into variance due to additive genetic effects (A: correlated 1.0 for MZ and 0.5 for DZ pairs), dominance genetic effects (D: 1.0 for MZ and 0.25 for DZ pairs), common (shared) environmental effects (C: by definition, correlated 1.0 for MZ and DZ pairs) and unique (non-shared) environmental effects (E: by definition, uncorrelated in MZ and DZ pairs). However, since our data included only twins reared together, we cannot simultaneously estimate shared environmental and dominance genetic effects. All genetic models were fitted by the OpenMx package (version 2.0.1) in the R statistical platform (**Boker et al., 2011**) using the maximum likelihood method.

Prior to conducting the modeling, height values were adjusted for the year of birth and twin cohort within each birth year and sex groups using linear regressions, and the resulting residuals were used as input phenotypes. The ACE sex-limitation model was selected as a starting point of the univariate modeling based on the following criteria: (i) MZ within-pair correlations were clearly higher than DZ correlations consistent with the influence of genetic effects, (ii) the magnitude of the difference between MZ and DZ correlations (rDZ > 1/2 rMZ) indicated the presence of common environmental effects and (iii) the lower within-pair correlations for OSDZ than for SSDZ twins observed for most birth-year groups suggested the presence of sex-specific genetic effects (results not shown). Previous findings from this international database showed that both male and female DZ twins are slightly taller than MZ twins in these age groups (Jelenkovic et al., 2015), and thus different means for MZ and DZ twins were allowed. The fit of the univariate models for height at each birth-year group is shown in Supplementary file 1B. In the present study, the equal-environment assumption was tested by comparing the ACE model to the saturated model. The fit of the models after Bonferroni correction of multiple testing did not worsen for most birth-year groups, which suggested that the assumption of equality of variances between MZ and DZ twins was not violated. When fixing A, C and E parameters to be the same in men and women, the fit of the model was poorer in all birth-year groups (p<0.0001), suggesting that these variance components differ between sexes. We additionally fitted a scale model allowing for different sizes of variance components but fixing the relative size of these components to be equal. Since this model also showed statistically significant differences (p<0.0001) in some birth-year cohorts, we decided to present the results separately for men and women. Sex-specific genetic effects were significant for some birthyear cohorts, and thus all modeling results are presented in sex-limited form for consistency. Comparative model fitting revealed that the C parameter could be not excluded from the model without a significant deterioration in fit. In order to study how birth year modifies the genetic and environmental variances of height, we additionally conducted gene-environment interaction modeling using birth year as an environmental modification factor (Purcell, 2002). This modeling offers intercept and interaction term describing the change per birth year which then need to be squared to get raw genetic and environmental variances. To make the results easier to understand, we calculated expected variance change with 95% CI per 25 years, i.e. approximately one human generation.

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### **Author contributions**

AJ, In charge of data management, Conducted the analyses, Wrote the first draft of the manuscript and has primary responsibility of the final content; Y-MH, YY, KOK, FRa, DIB, TIAS, JK, KS, Planned the study design of the CODATwins project, Collected the data used in this study, Commented the manuscript, Read and approved the final version of the manuscript; RS, SHS, MH, ASu, FRi, QT, DZ, ZP, SA, KH, SYÖ, FA, ER, ADT, DLT, KC, ASk, JLS, LJE, HHM, TLC, JLH, JRO, JFS-R, LC-C, WC, AEH, TMM, JS, Y-MS, SY, KL, CEF, WSK, MJL, AB, TLN, KEW, CK, KLJ, MG, DAB, MAS, CF, CD, GED, DB, CAD, RFV, RJFL, NGM, SEM, GWM, H-UJ, GES, RK, PKEM, NLP, AKD-A, TAM, TCE, AMG, PT, LAB, CT, GB, DN, PL, TDS, MMa, GL, MB, TCEMvB, GW, SAB, KLK, JRH, IB, TSN, RFK, MMcGu, SP, RPC, JvBH, JHG, YI, MW, CH, FI, BMH, Collected the data used in this study, Commented the manuscript, Read and approved the final version of the manuscript

### Ethics

Human subjects: All participants were volunteers and gave their informed consent when participating in their original study. Only a limited set of observational variables and anonymized data were delivered to the data management center at University of Helsinki. The pooled analysis was approved by the ethical committee of Department of Public Health, University of Helsinki.

# **Additional files**

### **Supplementary files**

• Supplementary file 1. Supplementary tables. (A) Height variance explained by additive genetic, shared environmental and unique environmental factors by birth year, sex and geographic-cultural region. (B) Model fit statistics for adult height by birth-year cohorts (all twin cohorts together). (C) Height variance and proportion of height variance explained by additive genetic, shared environmental and unique environmental factors by birth year, sex and geographic-cultural region.

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