1	Association of longer leukocyte telomere length with cardiac size, function, and
2	heart failure
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57 58	
59	Key Points
60	
61	Question: Is leukocyte telomere length (LTL) associated with alterations in cardiovascular
62	structure and function?
63	
64	Findings: Longer LTL is associated with higher left ventricular mass, larger ventricular and
65	atrial sizes and higher stroke volumes. Mendelian Randomisation analysis demonstrates the
66	causal genetic association between LTL on left ventricular mass, ventricular size and left
67	ventricular stroke volume. We also provide confirmatory evidence that longer LTL is
68	associated with a lower risk of incident heart failure after accounting for potential
69	confounders.
70	
71	Meaning: These findings highlight that modulation of LTL dynamics may have a role in
72	improving cardiovascular structure and function which could potentially explain the observed
73	lower future risk of heart failure.
74	
75	Tweet: "Longer telomere length is associated with a larger heart with better cardiac function
76	and a lower risk of heart failure."

77 A	bstract
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79	Importance: Longer leukocyte telomere length (LTL) is associated with a lower risk of
80	adverse cardiovascular outcomes. The extent to which variation in LTL is associated with
81	intermediary cardiovascular phenotypes is unclear.
82	Objective: To evaluate the relationships between LTL and a diverse set of cardiovascular
83	imaging phenotypes
84	Design: This is a cross-sectional study of UK Biobank participants recruited from 2006 to
85	2010. LTL was measured using a quantitative polymerase chain reaction method.
86	Cardiovascular measurements were derived from cardiovascular magnetic resonance (CMR)
87	using machine learning. The median (interquartile range) duration of follow-up was 12.0
88	(1.4) years. The associations of LTL with imaging measurements and incident heart failure
89	(HF) were evaluated by multivariable regression models. Genetic associations between LTL
90	and significantly associated traits was investigated by Mendelian Randomisation.
91	Setting: Population-based cohort study
92	Participants: UK Biobank participants with CMR and LTL data
93	Exposure: LTL
94	Main Outcomes and Measures: Cardiovascular imaging traits and heart failure
95	<b>Results:</b> The mean age of the cohort ( $n = 40,459$ ) was $55 \pm 7.6$ years; 48.3% were men.
96	Longer LTL was independently associated with a pattern of positive cardiac remodelling
97	(higher left ventricular mass (LVM), larger global ventricular size and volume, and higher
98	ventricular and atrial stroke volumes) and a lower risk of incident HF (Hazard ratio, 95%
99	confidence interval [CI]: 0.86, $0.81 - 0.91$ for LTL 4 <sup>th</sup> quartile vs 1 <sup>st</sup> quartile). Mendelian
100	Randomisation analysis suggested a causal association between LTL and LVM, global
101	ventricular volume and left ventricular stroke volume.

- 102 **Conclusions and Relevance:** Longer LTL is associated with a larger heart with better
- 103 cardiac function in middle age, which could potentially explain the observed lower risk of
- 104 incident heart failure.
- 105
- 106 Key words:
- 107 Leukocyte telomere length, cardiovascular remodelling, heart failure
- 108
- 109

# 110 Abbreviations

- 111
- 112 LTL, leukocyte telomere length
- 113 CAD, coronary artery disease
- 114 HF, heart failure
- 115 LVM, left ventricular mass
- 116 UKB, UK Biobank
- 117 CMR, cardiovascular magnetic resonance
- 118 LVSV, left ventricular stroke volume
- 119 LVMVR, left ventricular mass to end-diastolic volume ratio
- 120 RVSV, right ventricular stroke volume
- 121 HF, heart failure
- 122 LA, left atrium/atrial
- 123 RA, right atrium/atrial
- 124 WBC, white blood cell
- 125 SBP, systolic blood pressure
- 126 MET, metabolic equivalent of task
- 127 MR, Mendelian Randomisation
- 128 GWAS, genome-wide association study
- 129 CVD, cardiovascular disease
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#### 135 Background

136

137 Telomeres are protective caps at the end of chromosomes that progressively shorten with each cell division.<sup>1-3</sup> When telomeres reach a critical length, cells enter senescence; hence 138 telomere length is a marker of cellular replicative capacity and history.<sup>2</sup> At population level, 139 140 there is a considerable inter-individual variation in mean telomere length, usually measured in leukocytes (leukocyte telomere length, LTL), but also present in other tissues and manifest 141 142 from an early age.<sup>3</sup> In epidemiological studies, we and others have shown that shorter LTL is associated with risk of incident coronary artery disease (CAD) as well as heart failure (HF).4-143 <sup>6</sup> Mendelian Randomisation (MR) analyses have strongly suggested that the association of 144 145 shorter LTL with CAD is genetically causal although evidence for an association with HF is less certain.<sup>4</sup> 146 147 148 Cardiac imaging measurements such as left ventricular mass (LVM) are intermediary 149 phenotypes whose variability has also been shown to influence adverse cardiovascular outcomes, including CAD and HF.<sup>7</sup> Two previous studies have investigated the association of 150 LTL with LVM.<sup>8,9</sup> The first by Vasan et al<sup>8</sup> investigated 850 Framingham Heart Study 151 participants and the second by Kuznetsova and colleagues<sup>9</sup> examined 334 volunteers from the 152 153 Flemish Study on Environment, Genes and Health Outcomes. Both studies used the LVM 154 estimated by measurements from M-mode echocardiography and reported a positive 155 association between LTL and LVM. However, neither study examined whether the 156 relationship was consistent with a causal association. 157 158 UK Biobank (UKB) is a large population cohort established between 2006 and 2010 of

159 participants aged 40-69 years at recruitment.<sup>10</sup> Participants have been characterised in detail

160	using questionnaires, physical measurements, urinary and plasma biomarker measurements,
161	genomic assays and longitudinal linkage with multiple health record systems. <sup>11</sup> A sub-set of
162	participants have also undergone cardiovascular magnetic resonance (CMR) scans. We have
163	recently completed a large-scale measurement of LTL in UKB participants and identified a
164	large number of genetic variants associated with LTL which are useful for causal inference
165	(Mendelian Randomisation) analyses. <sup>4,12</sup> We have also derived measurements of cardiac
166	structure and function from the CMR scans using automated artificial intelligence-based
167	protocols. <sup>13,14</sup> Here, using these datasets we have examined (i) observational associations
168	between LTL and cardiac morphology, function and geometry including LVM, global
169	ventricular volume and size, left and right ventricular stroke volume (LVSV and RVSV),
170	LVM to end-diastolic volume ratio (LVMVR), atrial maximum volume and atrial emptying
171	volume, (ii) the genetic association between LTL and observationally associated CMR
172	measurements using Mendelian Randomisation, and (iii) the relationship between LTL and
173	future development of HF.
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175	Methods
176	
177	Subjects
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179	From participants with valid LTL measurements in UKB (n=474,074) <sup>12</sup> , we excluded
180	genetically related samples, randomly excluding one from each pair based on a kinship
181	coefficient of K>0.088 and samples with no genetic data or those that failed quality control.
182	We also excluded participants who lacked information on ethnicity or white blood cell
183	(WBC) count, which are both associated with $LTL^{12}$ and were used together with age and sex
184	to adjust the trait associations. Ethnicity was self-reported by the participants using a

185	touchscreen questionnaire at the assessment centre. Among the remaining subjects with LTL
186	measurements (n=422,797), 40,459 individuals participated in the ongoing CMR sub-study
187	(Figure 1). We followed the reporting guidelines outlined in the STROBE (Strengthening the
188	Reporting of Observational Studies in Epidemiology) statement from the EQUATOR
189	(Enhancing the QUAlity and Transparency Of health Research) network. This study received
190	the overall ethical approval for UK Biobank studies from the NHS National Research Ethics
191	Service on 17th June 2011 (Ref 11/NW/0382) which was extended on 18 June 2021 (Ref
192	21/NW/0157). All study participants provided written informed consent.
193	
194	Measurement of leukocyte telomere length
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196	Details of LTL measurements including extensive quality checks and the adjustment for
197	technical factors in the UK Biobank participants have been described previously by our
198	group <sup>12</sup> . In brief, LTL was measured as the ratio of telomere repeat copy number (T) relative
199	to that of a single copy gene (S, HBG) from the peripheral blood leukocyte DNA, extracted
200	from blood collected at baseline, using a multiplex quantitative polymerase chain reaction
201	(PCR) method. LTL measurements (T/S ratios) were log <sub>e</sub> -transformed due to non-normality
202	(log <sub>e</sub> -LTL) and Z-standardised for all analyses (UKB field code: 22192).
203	
204	Derivation of CMR parameters and arterial stiffness
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206	Detailed CMR protocol and analysis methods have been described in prior publications <sup>13–16</sup> .
207	Out of ~500,000 original UK Biobank participants, those living within a reasonable travelling
208	distance to one of the four imaging assessment centres were invited back for imaging
209	enhancement substudy with a target sample size of 100,000 individuals. The CMR scans

210 available for the current study (n~40,000) were obtained on average  $9.0 \pm 1.7$  years after the 211 baseline visit. Segmentation of the left and right ventricular and atrial cavities and left 212 ventricular myocardium and aortic luminal area were performed by automated machine learning algorithms as detailed previously<sup>13</sup>. Global ventricular volume was defined as the 213 214 sum of the right and left ventricular end-diastolic volumes. LVSV, RVSV and atrial stroke 215 volumes were calculated by the difference between respective end-diastolic volume and end-216 systolic volume. LVMVR was derived by dividing LVM with LV end-diastolic volume. Enddiastolic bi-ventricular shape models were obtained as described previously<sup>17</sup>. These models 217 218 were compiled into a statistical shape atlas through principal component analysis, with 219 principal components capturing the largest sources of variation in cardiac shape amongst the 220 cohort. Through plotting these principal components, we can estimate biological features that 221 they represent. The first principal component (PC1) represents the overall size of the heart 222 (higher scores having larger hearts) which was the greatest source of variation in heart shape amongst individuals (eFigure 1). 223

224

#### 225 Statistical analyses

226

227 The descriptive statistics are presented as mean  $\pm$  standard deviation [SD] for continuous 228 variables and number (percentage) for categorical variables. The trends across the LTL 229 quartiles were examined by Cuzick's extension of the Wilcoxon rank-sum test for continuous 230 variables and the Chi-square test for trend for ordinal variables. We removed the confounding 231 influence of chronological age at baseline, white blood cell count and self-reported ethnicity 232 by taking the residuals of log<sub>e</sub> LTL regressed on these variables. Participants with missing 233 data were excluded from the analysis. The relationships between log<sub>e</sub> LTL residuals 234 (independent variable) and CMR measures were evaluated in multivariable linear regression

235	models adjusted for age at the imaging visit, sex, height and weight. Significant associations
236	were additionally adjusted for traditional cardiovascular risk factors (systolic blood pressure
237	[SBP], diabetes mellitus, dyslipidaemia, smoking status and physical activity expressed in
238	total metabolic equivalent of task [MET] minutes per week) to interrogate the potential
239	confounding effects. Given the time lag between LTL sampling and CMR data acquisition, a
240	sensitivity analysis investigating the interaction between the time lag between these two dates
241	and LTL was conducted. We sought to identify the association between LTL and incident HF
242	by performing survival analyses using Cox proportional hazards models adjusted for age, sex,
243	body mass index (BMI), hypertension, hyperlipidaemia, diabetes mellitus, and smoking
244	status. We also explored the mediating effect of LTL and LVM on incident HF by
245	introducing an interaction term. The effect sizes were represented by one SD increase in log <sub>e</sub>
246	LTL residuals. All analyses were conducted in R version $4.0.2^{18}$ .
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248	Mendelian Randomisation
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248 249 250	<i>Mendelian Randomisation</i> To investigate the causality and directionality of the relationships of LTL with
<ul><li>248</li><li>249</li><li>250</li><li>251</li></ul>	Mendelian Randomisation To investigate the causality and directionality of the relationships of LTL with observationally associated imaging traits and with HF, we undertook Mendelian
<ul> <li>248</li> <li>249</li> <li>250</li> <li>251</li> <li>252</li> </ul>	Mendelian Randomisation         To investigate the causality and directionality of the relationships of LTL with         observationally associated imaging traits and with HF, we undertook Mendelian         Randomisation (MR) analysis, using large–scale genome-wide association study (GWAS)
<ul> <li>248</li> <li>249</li> <li>250</li> <li>251</li> <li>252</li> <li>253</li> </ul>	Mendelian Randomisation         To investigate the causality and directionality of the relationships of LTL with         observationally associated imaging traits and with HF, we undertook Mendelian         Randomisation (MR) analysis, using large–scale genome-wide association study (GWAS)         datasets. <sup>4,14,19</sup> To assess whether the associations between LTT and imaging parameters and
<ul> <li>248</li> <li>249</li> <li>250</li> <li>251</li> <li>252</li> <li>253</li> <li>254</li> </ul>	Mendelian Randomisation         To investigate the causality and directionality of the relationships of LTL with         observationally associated imaging traits and with HF, we undertook Mendelian         Randomisation (MR) analysis, using large–scale genome-wide association study (GWAS)         datasets. <sup>4,14,19</sup> To assess whether the associations between LTT and imaging parameters and         HF were consistent with a causal association, we used 130 conditionally independent, non-
<ul> <li>248</li> <li>249</li> <li>250</li> <li>251</li> <li>252</li> <li>253</li> <li>254</li> <li>255</li> </ul>	Mendelian RandomisationTo investigate the causality and directionality of the relationships of LTL with observationally associated imaging traits and with HF, we undertook MendelianRandomisation (MR) analysis, using large-scale genome-wide association study (GWAS) datasets. <sup>4,14,19</sup> To assess whether the associations between LTT and imaging parameters and HF were consistent with a causal association, we used 130 conditionally independent, non- pleiotropic genetic variants that we have recently reported to be associated with LTL in UK
<ul> <li>248</li> <li>249</li> <li>250</li> <li>251</li> <li>252</li> <li>253</li> <li>254</li> <li>255</li> <li>256</li> </ul>	Mendelian Randomisation         To investigate the causality and directionality of the relationships of LTL with         observationally associated imaging traits and with HF, we undertook Mendelian         Randomisation (MR) analysis, using large–scale genome-wide association study (GWAS)         datasets. <sup>4,14,19</sup> To assess whether the associations between LTT and imaging parameters and         HF were consistent with a causal association, we used 130 conditionally independent, non-         pleiotropic genetic variants that we have recently reported to be associated with LTL in UK         Biobank. <sup>4</sup>
<ul> <li>248</li> <li>249</li> <li>250</li> <li>251</li> <li>252</li> <li>253</li> <li>254</li> <li>255</li> <li>256</li> <li>257</li> </ul>	Mendelian Randomisation To investigate the causality and directionality of the relationships of LTL with observationally associated imaging traits and with HF, we undertook Mendelian Randomisation (MR) analysis, using large–scale genome-wide association study (GWAS) datasets. <sup>4,14,19</sup> To assess whether the associations between LTT and imaging parameters and HF were consistent with a causal association, we used 130 conditionally independent, non- pleiotropic genetic variants that we have recently reported to be associated with LTL in UK Biobank. <sup>4</sup>

random effect and also reported the p-value for the intercept from MR Egger<sup>21</sup> as a check for

horizontal pleiotropy. As sensitivity analyses, we undertook MR analyses using the Weighted
Median method <sup>22</sup> which is additionally robust in the presence of outliers and the MR Raps
method <sup>23</sup> which overcomes challenges related to measurement error, weak or invalid (due to
pleiotropy) measurements and selection bias (due to weak instrument). We also applied
Steiger filtering implemented in the steiger_filtering() function in the R package
'TwoSampleMR' to our genetic instruments which removed variants that explain more
variance in the outcome (i.e. imaging measurements or heart failure) than the exposure (LTL)
to minimise the risk of reverse causality. A combination of these approaches provides the
best evidence for the presence of a genetic association consistent with a causal relationship.
Results

272 The baseline characteristics of the study cohort (N = 40,459) stratified by the LTL quartiles 273 are presented in Table 1. The average age  $\pm$  SD was 55  $\pm$  7.6 years and 48.3% were men. 274 Individuals in the higher LTL quartiles were more likely to be chronologically younger and 275 female with a more favourable traditional cardiovascular risk profile. The vast majority of study cohort had CMR measurements within normal ranges<sup>24</sup>; the proportion of LVH was 276 277 2%. LVM trended downwards across the LTL quartiles in the overall cohort but when 278 stratified by sex, LVM was higher in the higher LTL quartiles for both men and women 279 (eTables 1 and 2). Our study cohort of UK Biobank participants who had CMR assessment 280 were marginally younger, slightly more likely to be male and white and had a lower 281 prevalence of cardiometabolic risk factors than those participants who did not receive CMR 282 examination (eTable 3).

283

## 284 Observational associations between LTL and cardiovascular measurements

286	After accounting for the differences in age, sex, height and weight, a positive association was
287	observed between LTL and LVM ( $\beta$ = 0.47 mg, 95% confidence interval [CI]: 0.34 – 0.60
288	mg per 1SD increment in log <sub>e</sub> LTL, $p = 4.0 \times 10^{-12}$ ) ( <b>Table 2</b> ). Similarly, longer LTL was
289	associated with larger global ventricular volume ( $\beta$ [95% CI] = 1.33 [0.87 – 1.79] ml, p = 1.8
290	x 10 <sup>-8</sup> ), larger overall ventricular size based on shape modelling ( $\beta$ [95% CI] = 0.01 [0.006 –
291	0.02], $p = 1.2 \times 10^{-4}$ ), higher LVSV ( $\beta$ [95% CI] = 0.35 [0.19 - 0.50] ml, $p = 8.7 \times 10^{-6}$ ),
292	higher RVSV ( $\beta$ [95% CI] = 0.34 [0.18 – 0.50] ml, p = 3.2 x 10 <sup>-5</sup> ), larger LA maximal
293	volume ( $\beta$ [95% CI] = 0.23 [0.05 – 0.41] ml, p = 1.4 x 10 <sup>-2</sup> ), higher LA emptying volume ( $\beta$
294	$[95\% \text{ CI}] = 0.12 [0.02 - 0.23] \text{ ml}, p = 2.2 \text{ x } 10^{-2})$ . Additional adjustment with cardiovascular
295	risk factors (SBP, diabetes, dyslipidaemia, smoking status and physical activity level) slightly
296	attenuated the effect sizes while retaining the statistical significance (Table 2). In contrast,
297	there were no significant associations of LTL with LVMVR, an adverse remodelling
298	phenotype, after adjusting for age, sex, height and weight. A sensitivity analysis investigating
299	the interaction between LTL and the time lag (between LTL sampling date and imaging visit
300	date) did not find any significant results.
301	
302	Longitudinal association between LTL and incident HF
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304 Among 406,602 UKB participants with valid LTL measurements free from prevalent

305 cardiovascular diseases, 7,827 individuals had incident HF over a median (interquartile

306 range) follow-up of 12.0 (1.4) years. In Cox proportional hazards analysis adjusted for age,

- 307 sex and other cardiovascular risk factors, longer LTL was associated with a lower future risk
- 308 of heart failure (LTL 4<sup>th</sup> quartile hazard ratio [HR] = 0.86, 95% CI = 0.81 0.91, p = 1.8 x
- $10^{-6}$ ) (Figure 2). Formal mediation analysis of LTL on the relationships between LVM (or

310	other imaging traits) and HF was not feasible due to the low event rates in the CMR sub-
311	cohort (total N ~ 40K, event N ~ 100) at this stage. Our exploratory interaction analysis of
312	LTL and LVM on incident HF showed an association with lower risk (interaction $HR = 0.87$ ,
313	p = 0.038).

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#### 315 Mendelian randomisation analyses

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- 317 Using 130 genetic variants independently associated with LTL as instruments (eTable 4), we
- 318 observed genetic associations of LTL with LVM, LVSV, global ventricular volume and
- 319 biventricular overall size from shape model with inverse variance weighted [IVW]  $\beta$  [95%
- 320 CI] = 0.13 [0.07 0.19], p = <0.0001,  $\beta$  [95% CI] = 0.08 [0.02 0.14], p = 0.013,  $\beta$  [95% CI]

321 = 0.08 [0.02 - 0.14], p = 0.014 and  $\beta [95\% \text{ CI}] = 0.04 [0.0002 - 0.07]$ , p = 0.049,

322 respectively (Figure 3). Other imaging traits and heart failure did not achieve a statistically

323 significant association with LTL although the overall effect directions were concordant with

- 324 observational results. There was no evidence of confounding by directional horizontal
- 325 pleiotropy (MR-Egger intercept p > 0.05). Sensitivity analyses with the weighted median and
- 326 MR RAPS methods gave similar estimates as our primary MR IVW models. Furthermore,
- 327 Steiger filtering which removed genetic variants that explain more variance in the outcomes
- 328 did not materially alter our findings (eTable 5).
- 329

### 330 Discussion

331

332 This is the first and largest study to investigate the relationship between LTL and a

- 333 comprehensive set of cardiac structure and function, robustly measured with CMR. Our
- 334 principal findings are that in a middle-aged population: (i) longer LTL is associated with

335	higher LVM, larger global ventricular volume and overall size, and higher ventricular and
336	atrial stroke volumes, (ii) confirmation that longer LTL is associated with a lower risk of
337	incident HF even after accounting from traditional cardiovascular risk factors, and (iii) the
338	genetic associations between LTL and LVM, LVSV and global ventricular volume are
339	concordant with the observational results.
340	
341	Our findings of an association of longer LTL with increased LVM are consistent with two
342	previous reports <sup>8,9</sup> which assessed LVM using echocardiography and build on these findings.
343	We advanced this insight by highlighting that longer LTL is also associated with larger global
344	ventricular volume and size and higher LVSV. Our finding of better LV systolic function
345	with longer LTL in a general population parallels the data from two small prior studies which
346	reported the associations between shorter LTL and reduced LV ejection fraction a
347	hypertensive mouse model <sup>25</sup> and in a human heart failure cohort <sup>26</sup> . The overall pattern of
348	cardiac morpho-functional differences observed with longer LTL (higher LVM, larger global
349	ventricular volume, static LVMVR, larger atria and higher ventricular and atrial stroke
350	volumes) closely resembles beneficial "balanced" myocardial remodelling frequently seen
351	with the physiological adaptation to exercise (i.e. athlete's heart) <sup>27</sup> . We also provide
352	compelling genetic evidence, based on multiple MR approaches, that the associations of LTL
353	with LVM, global ventricular volume and LVSV are consistent with a causal association.
354	
355	The impact of LTL on cardiac structure and function could have clinical relevance. We
356	demonstrated in this work that longer LTL is associated with a reduced observed incidence of
357	HF in UKB (HR 0.86, 95% CI = $0.81 - 0.91$ ). The MR analysis, although trending in the
358	same direction, was non-significant (MR odds ratio 0.96 (95% CI 0.89-1.03) per 1SD longer
359	LTL) possibly related to low power. However, no firm conclusion can be drawn based on this

360	data and future studies using information from larger GWAS are needed. Other studies have
361	shown that LTL is shorter in patients with HF and is associated with poor prognosis. <sup>6,28–30</sup>
362	Experimental studies also directly support a role of telomere dynamics in cardiac structure
363	and function. With ageing, telomerase knockout mice hearts showed shortening of telomeres,
364	attenuated proliferation and increased apoptosis of cardiomyocytes, and greater cardiac
365	remodelling and left ventricular failure <sup>31,32</sup> . On the other hand, enhanced expression of
366	telomerase reverse transcriptase in rat cardiomyocytes preserved telomere length, and
367	induced cardiomyocyte proliferation, hypertrophy and survival <sup>33</sup> . While it is recognised that
368	LV hypertrophy and LV dilatation in isolation are associated with adverse outcomes, through
369	access to a more comprehensive set of imaging features, our study demonstrated a more
370	global positive pattern of cardiac remodelling in association with longer LTL, which could
371	explain the lower incidence of HF.

## 373 Limitations

374

375 Our study benefited from several important advantages including: (i) access to the largest 376 sample size to date of LTL data and the diversity and accuracy of cardiovascular imaging 377 measurements using the reference standard CMR and (ii) application of Mendelian 378 Randomisation for causal inference analysis using the data from recent large genome-wide 379 association studies. Nevertheless, several limitations need to be acknowledged. First, there is 380 a "healthy volunteer" selection bias in the UK Biobank with the participants being older, 381 more affluent and having a healthier lifestyle with fewer comorbid conditions than the UK general population.<sup>34</sup> The imaging substudy cohort is even slightly healthier than the overall 382 383 UK Biobank cohort. In line with this observation, the majority of our study cohort had 384 imaging measurements within normal physiological ranges and the applicability of our

385	findings in disease states leading to left ventricular hypertrophy is uncertain. Second, the
386	majority of our cohort (97%) is of European descent which may limit the generalisability of
387	our findings in under-represented ethnicities. Third, telomere length was quantified in blood
388	leukocytes which may not reflect cell or tissue-specific telomere length. Finally, the LTL and
389	CMR measurements were obtained at different time points. The impact of this on the findings
390	is uncertain but, if anything, is likely to have blunted the magnitude of the observed
391	associations. Furthermore, our findings from Mendelian randomisation which circumvents
392	the issues of confounding, measurement errors and reverse causation in observational studies,
393	provide concordant results for the key findings.
394	
395	Conclusion
396	
397	Longer LTL is associated with higher LVM, larger global ventricular size and better cardiac
398	function and a lower risk of incident heart failure. Further investigations into the prognostic
399	relevance of LTL in adverse cardiac remodelling and the related mechanistic pathways could
400	provide insights into the novel risk stratification approaches and therapeutic targets for heart
401	failure.
402	
403	Data Sharing Statement
404	
405	The individual-level data can be requested from the UK Biobank via the standard access
406	request process (https://www.ukbiobank.ac.uk/enable-your-research/apply-for-access). the
407	Additional supporting information (statistical/analytic code) are available upon request.
408	
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457

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- 464
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585	Figure Legend
586	Figure 1. Sample selection flowchart
587	UKB, UK Biobank; LTL, leukocyte telomere length; WBC, white blood cell count; LVM, left
588	ventricular mass; LVSV, left ventricular stroke volume; LVMVR, left ventricular mass to end-
589	diastolic volume ration; LA, left atrial; RA, right atrial; RVSV, right ventricular stroke
590	volume
591	
592	Figure 2. Longitudinal association between LTL and incident heart failure
593	LTL, leukocyte telomere length; SD, standard deviation; BMI, body mass index
594	
595	Figure 3. Mendelian Randomisation associations between LTL and cardiac imaging traits and
596	heart failure

- 597 MR, Mendelian Randomisation; LTL, leukocyte telomere length; LV, left ventricular; RV,
- 598 right ventricular, LA, left atrial; HF, heart failure

	600	Table 1	. Study	cohort	characteristics
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		LTL quartiles				
	Full cohort	1 <sup>st</sup>	2 <sup>nd</sup>	3 <sup>rd</sup>	4 <sup>th</sup>	P trend
N	40459	10115	10115	10114	10115	
Age telomere visit (year)	55.1 (7.6)	56.9 (7.4)	55.6 (7.4)	54.7 (7.5)	53.3 (7.5)	< 0.0001
Age imaging visit (year)	64.2 (7.8)	65.8 (7.6)	64.6 (7.6)	63.8 (7.7)	62.4 (7.7)	< 0.0001
Male sex	19529 (48.3)	5558 (54.9)	5132 (50.7)	4655 (46.0)	4184 (41.4)	< 0.0001
Height (cm)	169.2 (9.3)	169.6 (9.2)	169.3 (9.3)	169.1 (9.3)	168.7 (9.2)	< 0.0001
Weight (kg)	75.9 (15.0)	76.9 (15.0)	76.1 (15.1)	75.7 (15.1)	74.8 (15.0)	< 0.0001
Ethnicity						
Asian	416 (1.0)	94 (0.9)	110 (1.1)	101 (1.0)	111 (1.1)	0.3545
Black	258 (0.6)	32 (0.3)	54 (0.5)	60 (0.6)	112 (1.1)	< 0.0001
Chinese	115 (0.3)	25 (0.2)	16 (0.2)	25 (0.2)	49 (0.5)	0.0007
Mixed	189 (0.5)	40 (0.4)	40 (0.4)	46 (0.5)	63 (0.6)	0.0145
Other	204 (0.5)	39 (0.4)	43 (0.4)	48 (0.5)	74 (0.7)	0.0006
White	39277 (97.1)	9885 (97.7)	9852 (97.4)	9834 (97.2)	9706 (96.0)	< 0.0001
SBP (mmHg)	139.1 (18.7)	140.1 (18.7)	139.5 (18.5)	138.9 (18.6)	137.7 (18.8)	< 0.0001
Diabetes mellitus	2359 (5.8)	731 (7.2)	624 (6.2)	523 (5.2)	481 (4.8)	< 0.0001
Hyperlipidaemia	14191 (35.1)	3920 (38.8)	3696 (36.5)	3447 (34.1)	3128 (30.9)	< 0.0001
Smoking status	1323 (6.4)	328 (6.2)	345 (6.7)	345 (6.7)	305 (5.9)	0.5363
Physical activity (Total MET minutes per week)	2750.4 (2432.8)	2706.1 (2408.5)	2796.3 (2474.2)	2759.4 (2441.1)	2740.1 (2406.7)	0.2028
WBC (mmol/L)	6.5 (1.5)	6.6 (1.5)	6.6 (1.5)	6.5 (1.5)	6.4 (1.5)	< 0.0001
LV mass (g)	86.0 (22.4)	87.3 (22.3)	86.4 (22.5)	85.7 (22.4)	84.7 (22.3)	< 0.0001
Indexed LV mass (g/m <sup>2</sup> )	45.3 (8.6)	45.6 (8.7)	45.5 (8.7)	45.2 (8.5)	45.0 (8.6)	< 0.0001
Global ventricular volume (ml)	303.2 (68.6)	304.3 (68.0)	303.4 (68.7)	303.2 (68.9)	302.1 (68.8)	0.0011
Indexed global ventricular volume (ml/m <sup>2</sup> )	160.6 (28.0)	159.8 (28.0)	160.5 (28.2)	160.8 (27.9)	161.3 (28.0)	0.0003

LVMVR (g/ml)	0.59 (0.09)	0.59 (0.09)	0.59 (0.09)	0.58 (0.09)	0.58 (0.09)	< 0.0001
LVSV (ml)	87.0 (19.2)	86.9 (19.0)	87.1 (19.3)	86.9 (19.3)	87.0 (19.0)	0.4253
Indexed LVSV (ml/m <sup>2</sup> )	46.2 (8.5)	45.8 (8.4)	46.2 (8.6)	46.2 (8.5)	46.6 (8.4)	< 0.0001
Overall ventricular size from shape model	0.01 (0.98)	0.05 (0.98)	0.03 (0.98)	0.01 (0.99)	-0.03 (0.98)	< 0.0001
RVSV (ml)	88.5 (20.2)	88.5 (20.2)	88.6 (20.1)	88.6 (20.4)	88.3 (20.0)	0.1665
Indexed RVSV (ml/m <sup>2</sup> )	47.0 (8.9)	46.6 (9.0)	47.0 (8.9)	47.1 (9.0)	47.3 (8.8)	< 0.0001
LA maximum volume (ml)	44.3 (17.1)	44.5 (17.5)	44.2 (17.2)	44.4 (17.2)	44.2 (16.5)	0.2063
Indexed LA maximum volume $(ml/m^2)$	23.8 (9.1)	23.7 (9.2)	23.7 (9.2)	23.9 (9.2)	24.0 (8.9)	< 0.0001
LA emptying volume (ml)	28.0 (9.8)	27.8 (9.9)	27.9 (9.9)	28.1 (9.9)	28.1 (9.6)	< 0.0001
Indexed LA emptying volume (ml/m <sup>2</sup> )	15.1 (5.4)	14.8 (5.3)	15.0 (5.4)	15.2 (5.4)	15.3 (5.4)	< 0.0001
RA maximum volume (ml)	49.8 (20.6)	50.2 (21.4)	49.6 (20.0)	49.8 (20.8)	49.7 (20.2)	0.6762
Indexed RA maximum volume (ml/m <sup>2</sup> )	26.9 (11.2)	26.8 (11.4)	26.7 (10.9)	26.9 (11.4)	27.0 (11.1)	0.0096
RA emptying volume (ml)	24.4 (10.8)	24.3 (11.1)	24.3 (10.6)	24.4 (10.8)	24.5 (10.8)	0.0061
Indexed RA emptying volume (ml/m <sup>2</sup> )	13.2 (6.0)	13.1 (6.1)	13.1 (5.9)	13.2 (6.1)	13.4 (6.1)	< 0.0001

SBP, systolic blood pressure; MET, metabolic equivalent of task; WBC, white blood cell count; LV, left ventricle; LVMVR, LV mass to end-diastolic volume ratio; LVSV, LV stroke volume; RVSV, right ventricular stroke volume; LA, left atrium; RA, right atrium; Other ethnicity category refers participants who selected "Other ethnic group" in the self-reported questionnaire.

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Table 2. Multivariable regression results for the association between LTL and cardiovascular measurements

	Model 1			Model 2			
	beta	95% CI	p value	beta	95% CI	p value	
LV mass (g)	0.47	0.34 to 0.60	3.97E-12	0.37	0.24 to 0.50	2.31E-08	
Global ventricular volume (ml)	1.33	0.87 to 1.79	1.84E-08	1.17	0.70 to 1.63	9.37E-07	
Overall ventricular size from shape model	0.01	0.006 to 0.02	1.23E-04	0.01	0.004 to 0.02	7.98E-04	
LVSV (ml)	0.35	0.19 to 0.50	8.67E-06	0.30	0.15 to 0.46	1.26E-04	
LVMVR (g/ml)	$6.90 \times 10^{-4}$	$-1.05 \text{ x}10^{-4} \text{ to } 1.49 \text{ x}10^{-3}$	8.90E-02	-	-	-	
RVSV (ml)	0.34	0.18 to 0.50	3.15E-05	0.27	0.11 to 0.43	8.76E-04	
LA maximum volume (ml)	0.23	0.05 to 0.41	1.36E-02	0.19	0.01 to 0.38	3.68E-02	
LA emptying volume (ml)	0.12	0.02 to 0.23	2.24E-02	0.09	-0.01 to 0.20	8.6E-02	
RA maximum volume (ml)	0.15	-0.06 to 0.35	1.62E-01	-	-	-	
RA emptying volume (ml)	0.09	-0.02 to 0.20	9.19E-02	-	-	-	

LV, left ventricle; LVSV, LV stroke volume, LVMVR, LV mass to end-diastolic volume ratio; RVSV, right ventricular stroke volume; LA, left 

atrial; RA, right atrial; CI, confidence interval 

Model 1: Adjusted for age, sex, height and weight 

Model 2: Adjusted for age, sex, height, weight, systolic blood pressure, diabetes mellitus, hyperlipidaemia, current smoking, total MET minutes 622 623 624 625 626 627 628 629 630 per week

(N = 474,074)	with LIL measurements	Missing or extreme LTL (N = 37,825)
		Missing or extreme WBC (N = 34,420)
		Nilssing or discordant sex (N = $3/3$ )
		O(R) = 2,777
		~
UKB imaging cohort with LT	↓ L measurements (N = 40,459	))))
LVM N = 40,332	RVSV N = 40,353	
Global ventricular size N =	LA max volume N = 35,348	
40,329		
LVSV N = 40,332	LA emptying volume N = 35,34	8
LVMVR N = 40,332	RA max volume N = 37,854	
Overall ventricular size (shape model) N = 35,295	RA emptying volume N = 37,85	54

Figure 1. Sample selection flowchart

638 UKB, UK Biobank; LTL, leukocyte telomere length; WBC, white blood cell count; LVM, left ventricular mass; LVSV, left ventricular stroke

639 volume; LVMVR, left ventricular mass to end-diastolic volume ration; RVSV, right ventricular stroke volume; LA, left atrial; RA, right atrial

Variable		Ν	Hazard ratio		р
LTL quartiles	Q1 (shortest)	101668	1 	Reference	
	Q2	101618	┝═┥	0.93 (0.88, 0.99)	0.03
	Q3	101652	⊨∎⊣ I	0.88 (0.83, 0.94)	<0.001
	Q4 (longest)	101664		0.86 (0.81, 0.91)	<0.001
Age (per SD)		406602	-	2.26 (2.20, 2.33)	<0.001
Sex	female	226913	1 	Reference	
	male	179689	HEH	1.65 (1.58, 1.73)	<0.001
BMI (per SD)		406602	•	1.39 (1.36, 1.42)	<0.001
Hypertension	no	302831		Reference	
	yes	103771	I I <b>⊢≣</b> +	1.61 (1.53, 1.69)	<0.001
Hyperlipidaemia	no	300840		Reference	
	yes	105762	-	0.99 (0.94, 1.04)	0.66
Diabetes mellitus	no	386753	, H	Reference	
	yes	19849	, , ⊢∎-(	1.74 (1.63, 1.86)	<0.001
Ever smoked	no	167391		Reference	
	yes	239211	H <b>E</b> H	1.21 (1.16, 1.27)	<0.001
			1 1.2 1.4 1.61.8 22.2		

Figure 2. Longitudinal association between LTL and incident heart failure

643 LTL, leukocyte telomere length; SD, standard deviation; BMI, body mass index



647 Figure 3. Mendelian Randomisation associations between LTL and cardiac imaging traits and heart failure

649 MR, Mendelian Randomisation; LTL, leukocyte telomere length; LV, left ventricular; RV, right ventricular, LA, left atrial; HF, heart failure



Variable		Ν	Hazard ratio		р
LTL quartiles	Q1 (shortest)	101668	÷	Reference	
	Q2	101618	⊢æ-{	0.93 (0.88, 0.99)	0.03
	Q3	101652	HEH	0.88 (0.83, 0.94)	<0.001
	Q4 (longest)	101664		0.86 (0.81, 0.91)	<0.001
Age (per SD)		406602	-	2.26 (2.20, 2.33)	<0.001
Sex	female	226913	÷	Reference	
	male	179689	HEH	1.65 (1.58, 1.73)	<0.001
BMI (per SD)		406602	•	1.39 (1.36, 1.42)	<0.001
Hypertension	no	302831		Reference	
	yes	103771	I I H∰H	1.61 (1.53, 1.69)	<0.001
Hyperlipidaemia	no	300840	÷	Reference	
	yes	105762	-	0.99 (0.94, 1.04)	0.66
Diabetes mellitus	no	386753	i i	Reference	
	yes	19849	. <b>⊢</b> ∎⊣	1.74 (1.63, 1.86)	<0.001
Ever smoked	no	167391		Reference	
	yes	239211		1.21 (1.16, 1.27)	<0.001

1 1.2 1.4 1.61.8 2 2.2

			_	
	(N = $474,074$ )	with LIL measurements		Missing or extreme LTL (N = 37,825) Missing or extreme WBC (N = 34,420) Missing or discordant sex (N = 373)
(				
	UKB imaging cohort with LI	L measurements (N = $40,4$	159)	
	LVM N = 40,332	↓ RVSV N = 40,353		
	Global ventricular size N = 40,329	LA max volume N = 35,348		
	LVSV N = 40,332	LA emptying volume N = 35	,348	
	LVMVR N = 40,332	RA max volume N = 37,854		
	Overall ventricular size (shape model) N = 35,295	RA emptying volume N = 37	,854	