ORIGINAL RESEARCH

Leukocyte Telomere Length and Cardiac Structure and Function: A Mendelian Randomization Study

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BACKGROUND: Existing research demonstrates the association of shorter leukocyte telomere length with increased risk of agerelated health outcomes including cardiovascular diseases. However, the direct causality of these relationships has not been definitively established. Cardiovascular aging at an organ level may be captured using image-derived phenotypes of cardiac anatomy and function.

METHODS AND RESULTS: In the current study, we use 2-sample Mendelian randomization to assess the causal link between leukocyte telomere length and 54 cardiac magnetic resonance imaging measures representing structure and function across the 4 cardiac chambers. Genetically predicted shorter leukocyte telomere length was causally linked to smaller ventricular cavity sizes including left ventricular end-systolic volume, left ventricular end-diastolic volume, lower left ventricular mass, and pulmonary artery. The association with left ventricular mass (β=0.217, P_{false discovery rate}=0.016) remained significant after multiple testing adjustment, whereas other associations were attenuated.

CONCLUSIONS: Our findings support a causal role for shorter leukocyte telomere length and faster cardiac aging, with the most prominent relationship with left ventricular mass.

Key Words: cardiac IDPs ■ Mendelian randomization ■ telomere

Clobal population aging has increased the burden of chronic noncommunicable diseases of older age, among which cardiovascular diseases (CVDs) are the most prominent.¹ The risk of age-related CVD is not uniform across the population. Indeed, biological cardiovascular aging is influenced by a wide range of environmental and lifestyle exposures throughout life.² Furthermore, the susceptibility to CVDs varies even among individuals with similar exposure profiles, suggesting the crucial role of inherent genetic determinants of biological aging.

Telomeres are distinct regions of repetitive nucleotide sequences and protein complexes at the end of chromosomes[.3](#page-6-2) Their function is to protect against nucleotide degradation, unnecessary recombination, repair, and interchromosomal fusion[.4,5](#page-6-3) Telomeres become progressively shorter with each cell division. Shorter leukocyte telomere length (LTL) has been linked to increased risk of death and age-related dis-ease, including a range of CVDs.^{[6](#page-6-4)} For instance, longer LTL is causally associated with decreased risk of myocardial infarction, coronary atherosclerosis, and ischemic heart disease.⁷ There is wide variation of LTL across the population with evidence of high and consistent heritability.^{8,9} As such, LTL has been proposed as an indicator of biological aging providing information beyond chronological age and environmental exposures. However, LTL can also be modified by diseases,

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Preprint posted on MedRxiv September 14, 2023. doi:<https://doi.org/10.1101/2023.09.13.23295516>.

This article was sent to Jacquelyn Y. Taylor, PhD, PNP-BC, RN, FAHA, FAAN, Guest Editor, for review by expert referees, editorial decision, and final disposition. Supplemental Material is available at<https://www.ahajournals.org/doi/suppl/10.1161/JAHA.123.032708>

For Sources of Funding and Disclosures, see page 7.

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CLINICAL PERSPECTIVE

What Is New?

- This is the first 2-sample Mendelian randomization study assessing the potential causal role of leukocyte telomere length and a wide range of metrics representing cardiac function and structure.
- Genetically predicted shorter leukocyte telomere is causally linked to smaller ventricular cavity sizes, particularly left ventricular mass.

What Are the Clinical Implications?

• The results of our study add a new risk factor to the vascular risk factors that should be considered to assess cardiac function and structure.

such as diabetes and atherosclerosis, which may confound its relationships with incident CVD and death[.6](#page-6-4) That is, the causality of the relationships between LTL and CVD is not adequately demonstrated in existing literature.¹⁰

Cardiac magnetic resonance (CMR) became an essential tool for the characterization of CVDs. The cardiovascular phenotype alters in a predictable and established manner with increasing age, which may be accurately captured using CMR[.11](#page-6-8) Thus, CMR phenotypes provide reliable continuous measures of cardiovascular aging. The recent availability of genome-wide association study (GWAS) data $12-15$ for a rich array of CMR phenotypes provides opportunity to evaluating causal associations of LTL with cardiovascular aging.

A statistical genetics technique that can help establish causality from GWAS results is Mendelian randomization (MR). A recent study used MR to examine the association between LTL and 7 CMR metrics.¹⁶ The findings indicate that shorter LTL was associated with reduced left ventricular (LV) mass (LVM), reduced LV stroke volume, reduced global ventricular volume, and reduced overall ventricular size. However, only the

reduction in LVM would survive multiple testing correction across the 7 explored traits. In particular, the study implemented a 1-sample MR, where the exposure (LTL) and outcome (CMR metrics) are obtained from the same cohort, which enabled the authors to leverage a large data set comprising N=446367 individuals to identify instrumental genetic instruments of LTL (exposure) for the MR analysis of whom N=40459 underwent CMR (outcome). However, such analyses are known to be more prone to bias compared with 2-sample MR.¹⁷ For instance, weak instruments bias the result toward the observed association between exposure and outcome,¹⁷ whereas winners curse may lead 1-sample MR to underestimate the true causal effect.¹⁸ Therefore, a 2-sample MR, where there is no overlap between the samples of the exposure and the outcome and which avoids such biases, can be used to substantiate these findings. Finally, Aung et al¹⁶ focused on the most common CMR metrics. However, there are further metrics, such as ejection fraction, which are of broad interest and can be explored using available GWAS summary statistics in a 2-sample MR framework.

In this study we used 2-sample MR to examine the causal association of LTL with 54 CMR phenotypes, leveraging publicly available GWAS summary statistics of LTL and cardiac phenotypes. This work provides novel insights into the causal associations of LTL with cardiovascular aging and its potential as a marker of biological cardiovascular age, independent of age and environmental exposures.

METHODS

The authors declare that all supporting data are available within the article and references.

Study Design

The GWASs summary statistics that support this analysis are previously published and downloadable results from different projects/cohorts including UK Biobank (UKB) and European Network for Genetic and Genomic Epidemiology. Ethical approval and participants formal consent were collected and approved in each study from the respective institutions.

Cardiac IDPs (Outcome) GWAS *Right Atrium*

The GWAS summary statistics of the right atrium¹² that are publicly available were considered in the current analysis. Right heart structure and function GWAS was conducted for 40000 participants from UKB. Participants were excluded if they had history with specific heart diseases. GWAS analysis was conducted for 34 CMR measures including right ventricular volume at end diastolic and end systolic, ejection fraction, and stroke volume. In addition, Pirruccello et al¹² conducted GWAS for the pulmonary system, including pulmonary root diameter, pulmonary artery, and diameter of pulmonary artery. Similar measures were also used but indexed for body surface area. Although their analysis was mainly focused on the right atrium, they also conducted GWAS for LV and right ventricular metrics. The full list of all 34 CMR measures reported and the GWAS results can be found in.¹²

Right Ventricular

To represent right ventricular phenotypes, we used publicly available GWAS summary statistics of the following 4 right ventricular measures: end systolic volume, stroke volume, ejection fraction, and end diastolic volume[.13](#page-7-3) In summary, the results are based on 29506 participants from UKB free from preexisting myocardial infarction or heart failure.

Left Atrium

GWAS was performed using 5 functional and volumetric left atrial (LA) variables from UKB for 35658 participants. The variables included LA minimum volumes, indexed LA maximum, LA active emptying fraction, LA passive emptying fraction, and LA total emptying fraction¹⁴

Left Ventricular

We used the GWAS summary statistics for the following 6 LV measures: end-diastolic volume, LVM, end-systolic volume (LVESV), ejection fraction, mass to end-diastolic volume ratio, and stroke volume[.15](#page-7-5) However, as the summary statistics of LV stroke volume were not available, this measure was excluded from further analyses. The study was conducted on 16923 European participants from the UKB.

Aortic Distensibility

GWAS was conducted to assess the association of the genetic bases and 6 aortic dimension and distensibility phenotypes. These included ascending aortic distensibility, ascending aortic minimum area, ascending aortic maximum area, descending aortic distensibility, descending aortic minimum area, and descending aortic maximum area.¹⁹ The analysis was conducted on 32590 White participants from the UKB.

Arterial Stiffness Index

Arterial stiffness index GWAS was conducted on 127 121 European-ancestry individuals from the UKB.²⁰ Such analysis has been facilitated by its ease of acquisition and its role in a wide range of CVDs. The analysis resulted in a set of variants in 4 loci that are significantly associated with arterial stiffness index.

LTL (Exposure) GWAS

We used 33 single nucleotide polymorphisms (SNPs) that have been shown to be significantly associated with LTL in previous studies. $21-23$ The first 20 SNPs were from a recent study that was conducted on 78592 European individuals, under the European Network for Genetic and Genomic Epidemiology (ENGAGE) prject. The remaining 13 SNPs were used before in 24 to conduct MR analysis with a wide range of aging-related outcomes. The focus on these studies, which did not use UKB data, for the selection of the instrumental variables (IVs) allows us to conduct a 2-sample MR study using CMR GWAS summary statistics that were obtained using UKB participants. Accordingly, there was no overlap between the participants included in the exposure (LTL) and the outcome (CMR image-derived phenotypes [IDPs]) GWASs. The process of selecting the IVs, linkage disequilibrium (LD) clumping, and performing MR analysis are motivated by the steps mentioned in.²⁵

The process of choosing proxies for SNPs that are not available for the GWAS on CMR measures and ensure that they are not in LD was performed as described previously.²⁶ Briefly, 10 SNPs were excluded as they were in high LD $(R^2>0.02)$ with other SNPs. Ensembl²⁷ was used to calculate LD using GBR (British in England and Scotland) samples from phase 3 (version 5) of the 1000 Genomes Project. The final list of the 23 SNPs is shown in Table [1.](#page-3-0)

Statistical Analysis

The statistical analysis was implemented using TwoSampleMR package²⁹ in R adopting inversevariance weighted method as the primary analysis. Weighted mode and weighted median methods were also performed as complementary MR analyses. The inverse-variance weighted method assumes no pleiotropy whereas weighted mode and weighted median allow for genetic pleiotropy.²⁵ In addition, weighted median presents consistent estimates when at least 50% of the selected variants are valid IVs.³⁰ Moreover, weighted mode assumes that the true causal association is coming from common causal effect even if the majority of IVs are invalid. 31 MR-Egger regression 32 and weighted median function³⁰ were used to detect heterogeneity and directional pleiotropy of the genetic instruments. To test for horizontal pleiotropy test, leave-one-SNP-out analyses, MR-Egger intercept test, and the modified Cochran Q statistic methods were applied. Moreover, MR–Pleiotropy Residual Sum and

Table 1. SNPs Used in the MR Analysis

*Indicates proxies as the original SNPs were not available for cardiac image-derived phenotype genome-wide arassociationea studies. Gene: the closet candidate genes. The reported position is from GRCh38 genome build. SNPs, ID of the SNP. Beta indicates beta value of the SNP in GWAS; Chr, chromosome; EA, effect allele; EAF, effect allele frequency; MR, Mendelian randomization; OA, other allele; Pos, position of the SNP in the genome; and SNP, single nucleotide polymorphism.

Outlier^{[33](#page-7-17)} was used to detect and correct pleiotropy. In addition, in order to further address the issue of potential pleiotropy, we conducted a sensitivity analysis after excluding any SNPs with evidence for a genome-wide association with another trait. To this end we screened all IVs against the GWAS Catalog ([https://www.ebi.ac.](https://www.ebi.ac.uk/gwas/) [uk/gwas/](https://www.ebi.ac.uk/gwas/); date accessed November 17, 2023) summary statistics. SNPs with *P* values below 5×10−8 for traits other than telomere length were considered for exclusion in a sensitivity analysis. False discovery rate³⁴ correction was finally applied to the inverse-variance weighted results to adjust for multiple tests across the 54 cardiac GWAS studies independently at α =0.05.

Sensitivity Analysis

After our initial screen, we conduct a multivariable 2 sample MR on significant outcomes to ensure the effects are not driven by body mass index or smoking. To further assess the association between LTL and LVM, we ran multivariable 2-sample MR to adjust the association for body mass index and smoking. Body mass index GWAS summary statistics were extracted from[,35](#page-7-19) which did not include UKB participants. In

terms of smoking, we used summary statistics from, 36 using cigarettes per day, without UKB participants and downloaded from ([https://conservancy.umn.edu/](https://conservancy.umn.edu/handle/11299/201564) [handle/11299/201564\)](https://conservancy.umn.edu/handle/11299/201564). Thereafter, we run the analysis using the TwoSampleMR package²⁹ and followed the instructions mentioned in [\(https://mrcieu.github.](https://mrcieu.github.io/TwoSampleMR/articles/perform_mr.html) [io/TwoSampleMR/articles/perform_mr.html\)](https://mrcieu.github.io/TwoSampleMR/articles/perform_mr.html) using the function mv_multiple().

RESULTS

In total 54 MR tests were conducted to examine the causal association of LTL and CMR phenotypes. All the IVs used from LTL GWAS were also available for cardiac IDPs, with the exception of 2 SNPs (rs13137667 and rs71325459) from the LV GWAS.¹⁵ We could not select suitable proxies for these 2 SNPs, because all variants in the region showed low LD (LD $<$ 0.01). Consequently, these 2 SNPs were excluded when MR was conducted between LTL and LV IDPs. Five measures showed nominally significant association with LTL in both the main and complementary analyses (Table [2\)](#page-4-0). Specifically, we found significant causal

The reported *P* values of MR-PRESSO are from the global test. i indicates indexed to body surface area; IVW, inverse-variance weighted; LTL, leukocyte telomere length; LVEDV, left ventricular end-diastolic volume; LVESV, left ventricular end-systolic volume; LVM (SE), the association with left ventricular mass after removing the 3 instrumental variables; MR, Mendelian randomization; MR-PRESSO, MR–Pleiotropy Residual Sum and Outlier; pa, pulmonary artery; and sa, short axis.

association of shorter LTL with smaller LV cavity volumes in end-diastole and end-systole (lower LV enddiastolic volume and LVESV) and lower LVM. Shorter LTL was also significantly associated with smaller short axis pulmonary artery size (in both indexed and nonindexed versions of this metric). There was no evidence of significant horizontal pleiotropy in these 5 measures, as per MR–Pleiotropy Residual Sum and Outlier (*P* value of global test was >0.05). In addition, the MR-Egger intercept *P* value was not significant indicating no directional pleiotropy. The association with LVESV was not significant in one of the complementary analyses (weighted median), whereas it was significant in other analyses. The associations with short axis pulmonary artery size (in both indexed and nonindexed versions of this metric), LV end-diastolic volume and LVESV were attenuated to statistically nonsignificant after multiple testing adjustment ($P_{\text{false discovery rate}}$ > 0.05). The association with LVM was the most robust, remaining statistically significant after multiple testing adjustment (*P*false discovery rate=0.016). The remaining CMR measures were not significantly associated with LTL (Table [S1\)](#page-6-10). The results showed that shortening LTL over time causes reduction particularly in LVM and suggestively in 4 other measures. The [Figure](#page-5-0) shows that LTL shortening causes reduction of all 5 cardiac IDPs over time.

For LVM we considered 2 sensitivity analysis. First, we repeated the analysis after excluding SNPs with a pleiotropic effect. The results from GWAS Catalog screening identified 3 IVs that are significantly associated with a wide range of traits, which might bias the MR analysis. The IVs are rs7705526 (with many traits including lung cancer and myeloid white cell count), rs76891117 (with systolic blood pressure), and rs7194734 (with body height; additional details in

Table [S2](#page-6-10)). Those 3 IVs were removed and the analysis was run again for LVM. The association with LVM remained significant after removing the 3 IVs (Table [2\)](#page-4-0). In fact, the effect size was stronger than with the original set of IVs. Second, we conducted the multivariable 2-sample MR between LTL and LVM adjusted for body mass index and smoking. The analysis also indicated a significant association (β=0.2001, *P* value=0.0184).

DISCUSSION

We present an extensive evaluation of the causal relationships between LTL and 54 cardiac IDPs using 2-sample MR analysis. We demonstrate causal association of shorter LTL with smaller LV cavity volumes (smaller LV end-diastolic volume and LVESV) and lower LVM. The most robust association was between LTL and LVM, with the association remaining significant after multiple testing correction of the primary analysis. The pattern of associations reflects associations of LTL with a pattern of cardiovascular phenotypic alterations in keeping with greater cardiac aging. These phenotypic alterations have been shown to confer significant cardiovascular risk, particularly when present at younger ages. Thus, our work supports a causal role for LTL in driving poorer cardiovascular health and sheds light into potential mechanisms causing differential susceptibility to CVD across the population. The pattern of phenotypic alterations observed in association with shorter LTL is consistent with age-related cardiovascular changes reported in population imaging cohorts[.37](#page-7-24) There are distinct age-related morphological alterations of the heart, which are reflected in cardiovascular imaging phenotypes and widely reported in the literature.¹¹ Increasing age is associated with

Figure. Association of LTL and the 5 cardiac IDPs in the primary (IVW) and in the complementary analyses. IDPs indicates image-derived phenotypes; IVW, inverse-variance weighting; LTL, leukocyte telomere length; LVEDV, left ventricular end-diastolic volume; LVESV, left ventricular end-systolic volume; LVM, left ventricular mass; MR, Mendelian randomization; and SNP, single nucleotide polymorphism.

cardiomyocyte attrition,³⁸ which is detected as lower LVM on CMR. There is also substantial decline in LV volumes with increasing age, which is disproportionately greater than the LVM decline, therefore resulting in a concentric pattern of LV remodeling in older ages.³⁷ With regard to functional metrics, the pattern is more complex; poorer strain metrics are generally noted, although their measurement on CMR can be challenging. LV stroke volume is reduced with increasing age but accompanied by minimal or no change in LV ejection fraction. Increased vascular stiffness with older age is well described in the literature³⁹ and linked to the described ventricular remodeling through patterns of ventricular-arterial coupling.⁴⁰ The described age-related cardiovascular alterations have been linked to increased risk of cardiovascular events. Thus, the observed associations with shorter LTL in our study are well matched to existing knowledge on cardiac age-related remodeling. It is worth mentioning that the rate of telomeres length shortening over time is different across cell types.⁹ Telomeres in proliferative cells such as leukocytes experience higher shortening rate compared with nonproliferative cells such as muscle cells.⁴¹ Accordingly, the rate of telomere length shortening in muscular tissue such as cardiac would be slower than in the other tissues.⁴²

Although our analysis indicates a causal relationship between shorter LTL and age-related LV remodeling, it is not clear whether this represents a direct

effect of LTL or an indirect effect mediated through greater propensity to risk factors such as diabetes. Indeed, previous work has been linked shorter LTL to poorer glycemic control,⁴³ higher blood pressure,⁴⁴⁻⁴⁶ and total cholesterol.⁴⁷ It is likely that LTL acts through multiple direct and indirect pathways to accelerate cardiac aging and increase propensity to disease. Further studies elucidating these precise mechanisms are essential to advance knowledge in this area. The associations with right ventricular and atrial metrics were not significant in our analysis. This may reflect greater technical challenges in deriving these phenotypes and thus greater noise limiting detection of SNPs in GWAS for these metrics. For instance, the right ventricle has an irregular anatomy, and its segmentation is far more challenging than the LV with greater interoperator variation[.48](#page-7-33) It is also possible that the LV reflects more readily age-related alterations than the other chambers. The associations of CMR metrics with aging are not extensively studied due to limited availability of large population cohorts. As the performance automated segmentation tools improve and with greater availability of population data sets our understanding of the genetic architecture of the heart is expected to improve with greater opportunity to understand its alterations with age.

The IVs (SNPs) used in our analysis belong to wide range of genes that regulate LTL and are also linked to the development of cardiac diseases and vascular risk factors. The rs11125529, rs7675998, rs8105767, and rs7194734 SNPs belong to the *ACYP2, NAF1, ZNF208*, and *MPHOSPH6* genes, respectively, which were found to be associated with increasing risk of developing coronary heart disease[.22,49,50](#page-7-21) In addition, rs6772228 belongs to the *PXK* gene, which is associated with total cholesterol levels[.51](#page-8-0) Finally, the *RTEL1* gene plays a pro-tective role against coronary heart disease.^{[52](#page-8-1)}

Importantly, our study confirms the previously reported causal association between LTL and LV[M16](#page-7-0) using 2-sample MR, which is less susceptible to bias compared with 1-sample MR. Similarly to Aung et al[,16](#page-7-0) who reported a nominally significant effect between LTL and LV stroke volume, there were also significant associations between LTL and LV end-diastolic and end-systolic volume, but these did not survive multiple testing correction. Interestingly, our results were achieved using only 23 SNPs as IVs, which were previously reported to be significantly associated with LTL, as compared with the 130 SNPs by Aung et al^{16} based on a UKB GWAS analysis. Of note, the effect sizes in our study were larger than the ones previously reported using 1-sample MR. For example, the effect size of LVM in our study is (β=0.21) per 1-SD increase in genetically determined telomere length, whereas Aung et al¹⁶ report (β =0.13). Accordingly, the results of the current study provide additional robust evidence for a causal association between LTL and CMR metrics.

A constant concern in MR analyses is bias due to horizontal pleiotropy. We attempted to address this constraint in two ways. First, we used statistical methods that attempt to detect pleiotropy and adjust for pleiotropy (MR–Pleiotropy Residual Sum and Outlier). None of our nominally significant associations showed evidence of pleiotropy using this method. Second, we manually screened the IVs against a large database of published GWAS results (GWAS Catalog). Instruments that were found to be strongly related to other traits were removed as IVs in a sensitivity analysis. Across both these approaches our main result of LTL influencing LVM remained significant. However, despite these efforts we cannot fully exclude the risk of a bias in our MR results due to pleiotropy.

CONCLUSIONS

To the best of our knowledge, this is the first study that attempts to assess the casual link between LTL and a wide range of cardiac IDPs. Our results indicate a significant and causal role of LTL on the LV structure. A previous study² demonstrated the role of wide range of daily lifestyle and exposures in cardiac aging. Our study identified a new significant player in cardiac aging, which might help to better understand the aging-driven factors.

ARTICLE INFORMATION

Received October 30, 2023; accepted January 4, 2024.

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Sources of Funding

Ahmed M. Salih is supported by a British Heart Foundation project grant (PG/21/10619). Ilaria Boscolo Galazzo and Gloria Menegaz acknowledge support from Fondazione CariVerona (Bando Ricerca Scientifica di Eccellenza 2018, EDIPO project, num. 2018.0855.2019) and MIUR D.M. 737/2021: AI4Health: empowering neurosciences with eXplainable AI methods.

Disclosures

None.

Supplemental Material

Tables S1–S2

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