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The impact of lung function on cardiovascular diseases and cardiovascular risk factors: a two sample bi-directional Mendelian randomization study

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# Abstract

**Introduction:** Observational studies suggested lung function is inversely associated with cardiovascular disease (CVD) although these studies could be confounded. We conducted a two sample Mendelian randomization study using summary statistics from genome wide association studies (GWAS) to clarify the role of lung function in CVD and its risk factors, and conversely the role of CVD in lung function.

**Methods:** We obtained genetic instruments for forced expiratory volume in 1 second (FEV<sub>1</sub>: 260) and forced vital capacity (FVC: 320) from publicly available UK Biobank summary statistics (n=421,986) and applied to GWAS summary statistics for coronary artery disease (CAD) (n=184,305), stroke (n=446,696), atrial fibrillation (n=1,030,836), and heart failure (n=977,320) and cardiovascular risk factors. Inverse variance weighting was used to assess the impact of lung function on these outcomes, with various sensitivity analyses. Bi-directional Mendelian randomization was used to assess reverse causation.

**Results:** FEV<sub>1</sub> and FVC were inversely associated with CAD (odds ratio (OR) per standard deviation (SD) increase, 0.72 (95% confidence interval (CI) 0.63 to 0.82) and 0.70 (95%CI 0.62 to 0.78)), overall stroke (0.87 (95%CI 0.77 to 0.97), 0.90 (0.82 to 1.00)), and some stroke subtypes. FEV<sub>1</sub> and FVC were inversely associated with type 2 diabetes and systolic blood pressure. Sensitivity analyses produced similar findings although the association with CAD was attenuated after adjusting for height (e.g. OR for 1SD FEV<sub>1</sub> 0.95 (0.75 to 1.19), but not for stroke or type 2 diabetes. There was no strong evidence for reverse causation.

**Conclusion:** Higher lung function likely protect against CAD and stroke.

## Key messages

## What is the key question?

Does higher lung function protect against cardiovascular disease, and is there evidence of reverse causation?

## What is the bottom line?

This Mendelian randomization study suggests higher lung function likely reduces coronary artery disease and stroke risk, and there is little evidence suggesting reverse causation.

# Why read on?

This is one of the largest Mendelian randomization studies exploring the impact of lung function in a wide range of cardiovascular diseases and their risk factors, as well as assessing possible reverse causation.

### Introduction

Poorer lung function is associated with cardiovascular disease (CVD).<sup>1-4</sup> However, these associations could be confounded by lifestyle factors, such as physical activity and smoking, and anthropometric characteristics, such as height, which are difficult to account for in observational studies.

Mendelian randomization is potentially less vulnerable to residual confounding than observational studies because it utilizes genetic variants related to exposures which are randomly allocated during conception.<sup>5</sup> A previous Mendelian randomization study suggested higher FEV<sub>1</sub> related to lower risk of coronary artery disease (CAD), whilst the relation for FVC was less clear.<sup>6</sup> However, that study used a relatively small number of genetic instruments (i.e.16 instruments for FEV<sub>1</sub> (variance explained (R<sup>2</sup>): 0.8%) and 10 instruments for FVC (R<sup>2</sup>: 0.4%)), did not consider other important CVDs, such as stroke and heart failure, and did not explore the possibility of bidirectional effects (i.e. CVDs also having an effect on lung function).<sup>6</sup> Furthermore, the study used genetic instruments extracted from genome wide association studies which were adjusted for height and smoking, which may introduce collider bias and hence potentially identify invalid instruments.<sup>7</sup> Another Mendelian randomization study provided evidence that lung function may protect against CAD although that study focused primarily on the mechanistic pathway between height and CAD risk instead of the etiologic role of lung function in cardiovascular diseases.<sup>8</sup>

The aim of this study was to determine the causal effect of FEV<sub>1</sub> and FVC on a wide range of cardiovascular diseases using two sample Mendelian randomization with summary statistics.<sup>5</sup> Our study adds to previous Mendelian randomization studies by

including more genetic instruments and more CVD outcomes and risk factors. We also explored whether genetic predisposition to CVDs might cause variation in lung function.

### Methods

### Study Design

We used two sample summary data Mendelian randomization to assess the effect of FEV<sub>1</sub> (per standard deviation (SD)) and FVC (per SD) on multiple CVD outcomes: (i.e. CAD, stroke and its subtypes, heart failure, atrial fibrillation) and CVD risk factors (i.e. systolic and diastolic blood pressure, high density and low density lipoprotein cholesterol, triglycerides, type 2 diabetes, fasting glucose, glycated hemoglobin and insulin).<sup>5</sup> Table 1 summarizes the study design including the sources of GWAS summary data for exposure (FEV<sub>1</sub> and FVC – Sample 1) and each CVD outcome and risk factors (Sample 2). Given Mendelian randomization has stringent assumptions (i.e. relevance, independence and exclusion restriction), we also assessed whether the genetic instruments affected key confounders for CVD (education, body mass index (BMI), smoking, alcohol consumption, and height) to check exclusion restriction.<sup>9</sup>

#### Ethics approval

In this study we have used publicly-available GWAS results from relevant publications and database (<u>https://gwas.mrcieu.ac.uk/</u>).<sup>10-23</sup> No individual participant data were collected or used. Details of ethical approval and participant consent for each of the studies that contributed to the GWAS can be found in the original publications.

### Genetic determinants of FEV<sub>1</sub> and FVC (Sample 1)

Genetic determinants of FEV<sub>1</sub> (in standard deviation (SD), GWAS ID: ukb-b-19657) and FVC (SD, GWAS ID: ukb-b-7953) were extracted from summary genome-wide association study results in the UK Biobank, available in the IEU GWAS database (<u>https://gwas.mrcieu.ac.uk/</u>).<sup>14 15</sup> In brief, the UK Biobank is a large prospective cohort study where more than 500,000 participants were recruited in the United Kingdom (Great Britain only) from 2006 to 2010 (mean age: 56.5; 54% female). Pre-bronchodilation lung function testing was performed by trained healthcare staff using a Viitalograph Pneumotrac 6800 spirometer (Maids Moreton, UK). Genotyping was done using the Affymetrix UK BiLEVE Axiom array (~50,000 participants) and Affymetrix UK Biobank Axiom array (~450,000 participants). The summary statistics were generated using a linear mixed model to account for relatedness and population stratification, and adjusted for sex and genotyping array. The analyses were restricted to 421,986 participants of European descent. Quality controls included exclusion based on imputation quality (specific INFO scores based on minor allele frequency (MAF)) and MAF (<=1%) (Supplemental Table 1).

## Genetic associations with the outcomes (Sample 2)

Complete summary GWAS results for CAD (CARDIoGRAMplusC4D 1000 Genome based GWAS),<sup>10</sup> stroke and its subtypes (MEGASTROKE consortium),<sup>11</sup> atrial fibrillation,<sup>12</sup> heart failure (HERMES consortium),<sup>13</sup> systolic and diastolic blood pressure (UK Biobank associations obtained from IEU GWAS database),<sup>14 15</sup> low density lipoprotein (LDL), high density lipoprotein (HDL) cholesterol and triglycerides (GLGC),<sup>16</sup> type 2 diabetes (DIAGRAM),<sup>21</sup> fasting glucose, insulin, and glycated

hemoglobin (MAGIC),<sup>19 20</sup> were obtained from publicly available online GWAS summary data repositories, with majority of them retrieved via MR Base.<sup>15</sup> Table 1 summarizes the numbers (including the cases and controls where relevant) included in these GWAS, population (including ethnicity) and the sample size in the GWAS. Additional details, including quality control, imputation methods, and any covariates adjusted for in each GWAS and how the outcomes were defined are provided in Supplemental Table 1.

# Selecting genetic instruments from the exposure GWAS, identifying these in outcome GWAS and harmonizing instruments across studies

We identified genetic instruments for lung function at genome wide significant p value (<5x10<sup>-8</sup>), and we excluded instruments which were in high linkage disequilibrium (LD) with other instruments (r<sup>2</sup><0.001). We searched for the genetic instruments in the outcome datasets. For genetic instruments not available for an outcome, a proxy instrument in high LD with the original instrument (r<sup>2</sup>>=0.8) was identified via MR-Base based on 1000 Genomes catalog (CEU reference population).<sup>15</sup> No proxy instruments were identified for outcomes not available in MR-Base. We aligned each genetic association for exposure and outcome on the same effect allele. We used effect allele frequency (values outside of 0.42 to 0.58) to ensure palindromic genetic instruments were aligned properly where that was possible.

## Statistical analysis

We estimated the  $R^2$  of each genetic instrument and summed them up to compute the overall  $R^2$  and F statistics using the sample size which the instruments for lung

function was derived from (n=421,986). Higher R<sup>2</sup> and F statistic values suggest lower risk of weak instrument bias.<sup>24</sup> For our main Mendelian randomization analyses, we used inverse variance weighting (IVW) with multiplicative random effects to obtain the causal effect of FEV<sub>1</sub> and FVC on CVD outcomes and their risk factors. IVW assumes there is no unbalanced horizontal pleiotropy.<sup>25</sup> To assess the presence of potentially invalid instruments, we checked for evidence of heterogeneity across instrument-specific Wald ratios (i.e ratio of instrument-outcome association to instrument-exposure association) using Cochrane Q test. Heterogeneity may result from horizontal pleiotropy.

# Additional analyses to explore potential violation of Mendelian randomization assumptions

MR assumes that genetic instruments do not affect confounders of the exposureoutcome association. We assessed the plausibility of this assumption by exploring whether the FEV<sub>1</sub> and FVC genetic instruments were related to key confounders defined as plausibly affecting lung function and CVDs (body mass index, height, socioeconomic position, alcohol and smoking).<sup>9</sup> This was done using publicly available summary genome wide association study data for: body mass index,<sup>18</sup> education (as a measure of socioeconomic position),<sup>22</sup> number of drinks of alcohol per week and number of cigarette smoked per day,<sup>17</sup> and height.<sup>23</sup> Specifically, we meta analyzed the estimate of each SNP-outcome association (per lung function increasing allele) using standard inverse variance weighting method with additive random effects. For confounders which were associated with the genetic instruments, we then assessed whether these associations were a sign of vertical pleiotropy (causal role of lung function on confounders) or horizontal pleiotropy

(causal role of confounders on lung function) using bi-directional Mendelian randomization.<sup>9</sup> We used multivariable Mendelian randomization to control for potential horizontal pleiotropy by including estimates from the relevant confounders which were strongly associated with genetic instruments for lung function.<sup>9</sup> Given the possibility of varying instrument strengths with increasing number of variables being adjusted for in multivariable Mendelian randomization and hence limits the interpretation of the findings,<sup>26</sup> we only considered variables which were strongly associated with the instruments for FEV<sub>1</sub> and FVC. We also approximated the conditional F statistics to evaluate potential weak instrument bias,<sup>26</sup> presented Cochrane Q test to evaluate heterogeneity, and also provided estimates for multivariable MR-Egger to assess robustness of findings due to pleiotropy.<sup>27</sup>

To assess unbalanced horizontal pleiotropy bias we undertook the following sensitivity analyses: MR-Egger,<sup>28</sup> weighted median analyses,<sup>29</sup> and MR-PRESSO,<sup>30</sup> that are more robust than IVW to the assumption that there is no effect of the genetic instrument on outcome other than through the exposures of interest (i.e. no horizontal pleiotropy paths). Like IVW, MR-Egger and MR-PRESSO require that the InSIDE ('instrument strength is independent of direct effect') assumption is not violated. Specifically, InSIDE assumes there is no correlation between the strength of the instrument (association of FEV<sub>1</sub> or FVC on their respective genetic instruments) and the strength of any association of the genetic instruments on the outcome not via the exposures of interest (e.g. any horizontal pleiotropy paths). The weighted median analyses assumed at least 50% of the weight of the genetic instruments is via the exposure of interest. Further details of these methods and their additional (and differing) assumptions are available in the supplemental material.

#### Bi-directional Mendelian randomization

To assess potential reverse causation, i.e. predisposition to CVDs affecting variation in FEV<sub>1</sub> or FVC , we also conducted a Mendelian randomization using genetic predictors of risk of CAD, overall stroke, heart failure, and atrial fibrillation as instruments.<sup>10-13</sup> We used IVW to explore evidence of effects of genetic predispositions to these CVDs on FEV<sub>1</sub> or FVC.

All analyses were performed using R Version 3.5.2 (R Development Core Team, Vienna, Austria) using R packages ("TwoSampleMR"), and ("MRPRESSO).<sup>15 30</sup>

## Results

For FEV<sub>1</sub>, up to 260 SNPs were used in the analyses, and these instruments explained up to 3.5% of FEV<sub>1</sub> variance (Overall F statistics: 58.8). For FVC, up to 320 SNPs were used in the analyses, and these instruments explained up to 4.8% of FVC variance (Overall F statistics: 66.4). Supplemental Tables 2-3 shows the summary statistics of the lung function instruments used in this study.

Figure 1 shows that higher FEV<sub>1</sub> was associated with lower risk of CAD, overall stroke and some subtypes (i.e. ischemic stroke, small vessel stroke, large artery stroke), and type 2 diabetes, but increased risk of atrial fibrillation and had no association with heart failure. FVC showed similar relation with these outcomes (Figure 2). Regarding the association with cardiovascular risk factors, higher FEV<sub>1</sub> was mainly associated with lower systolic blood pressure and triglycerides (Figure 3). FVC showed similar relations with these outcomes and FVC was also associated with lower LDL cholesterol, glucose and insulin (Figure 4). Figures 1-4 show that

between SNP Wald ratio heterogeneity was high for most of the outcomes although there was no strong evidence for directional horizontal pleiotropy based on the MR-Egger intercepts, with the exception of atrial fibrillation. Corresponding sensitivity analyses generally gave directionally similar estimates for most outcomes although differences were observed when using multivariable Mendelian randomization analyses (Figures 1-4, and Supplemental Tables 4-5).

Based on the results in Supplemental Tables 6-7, we identified BMI, height and education as possible horizontal pleiotropic effects which may bias the main analyses. Given height had a much stronger association with the instruments and knowledge that height is an established cause of lung function, we undertook multivariable MR adjusting for height only. With adjustment for height, the effect estimates were directionally similar to the main analyses although estimates for CAD attenuated substantially, whilst the effect estimate for stroke and type 2 diabetes remained similar. Given the lower statistical power in these analyses the confidence intervals are wider, as expected, and in the case of stroke included the null value (Figures 1 and 2). The positive association with atrial fibrillation disappeared and lung function was potentially associated with lower risk of heart failure although with confidence interval overlapping null (Figures 1 and 2). Similar findings were observed when we used multivariable MR-Egger method (Supplemental Figures 1-4). However, these analyses need to be treated with some caution as the conditional F statistics were small, ranging from 7.8 to 9.9 for FEV<sub>1</sub> and 10.0 to 11.6 for FVC.

Figure 5 shows the association of predisposition to cardiovascular disease with FEV<sub>1</sub> and FVC, using genetic instruments for CVD (Supplemental Table 8). Predisposition

to coronary artery disease, stroke, atrial fibrillation and heart failure was not associated with FEV<sub>1</sub> or FVC. This provides evidence against possible reverse causation when assessing the relation of lung function with cardiovascular diseases.

### Discussion

In this Mendelian randomization study which we explored the impact of lung function on the risk of CVDs and risk factors which may mediate any observed effects on CVDs (blood pressure, lipids, glycemic traits). Our study provides suggestive evidence that better lung function is cardioprotective. These findings were consistent across a range of sensitivity analyses used to explore possible bias due to horizontal pleiotropy, except for CAD where the association was attenuated after adjusting for height. We also found novel evidence that better lung function protects against stroke and type 2 diabetes, with these effects being consistent across sensitivity analyses, including adjustment for height. The positive association between lung function and atrial fibrillation in our main Mendelian randomization is in the opposite direction to that seen for other CVD outcomes but attenuated to the null with adjustment for height. The impact of lung function on heart failure is also less clear than that seen for CAD, stroke and type 2 diabetes, as the protective effect is only evident when adjusting for height in the multivariable Mendelian randomization. Lastly, our study also suggested that genetic susceptibility to CVD is unlikely to affect lung function.

Previous observational studies have suggested poorer FEV<sub>1</sub> and FVC increase CVD.<sup>1-4</sup> Our study suggests these observed associations are likely causal for CAD and stroke. Multiple pathways may explain the protective effect, with our study

suggesting systolic blood pressure is a possible mechanism, but with weaker evidence of an effect of lung function on diastolic blood pressure. This may imply poorer lung function primarily acts on arterial stiffness,<sup>31</sup> and hence may contribute to systemic hypertension. We also found better lung function associated with lower triglycerides and LDL cholesterol, lower insulin and type 2 diabetes. As previous Mendelian randomization studies support a causal effect of hypercholesterolemia, hyperglycemia, type 2 diabetes and higher insulin on CAD,<sup>32-35</sup> these are possibly also mediators of the effect of lung function on CAD. With the exception of an inverse association with triglycerides, we did not find strong evidence for a causal effect of lung function on lipids. Our study also indicated the importance of height as a horizontal pleiotropic effect, given the associations with coronary artery disease were attenuated in the multivariable Mendelian randomization. Nevertheless, further investigation would be needed as attenuation may reflect weak instrument bias and was sensitive to where the SNP-height estimates in the multivariable Mendelian randomization were extracted from (GIANT in Supplemental Figure 1 versus UK Biobank in Supplemental Figure 5).

In our main analyses we found evidence of a protective effect of lung function on overall, ischemic, small vessel and large artery stroke, but not cardioembolic stroke. The underlying mechanisms may include reduced blood pressure,<sup>36</sup> reduced risk of type 2 diabetes,<sup>37</sup> whilst the role of lipid is not as clear.<sup>35</sup> The lack of large GWAS with publicly available data on hemorrhagic stroke mean that we were not able to explore this outcome and it is not included in the overall stroke outcome. Sensitivity analyses were largely supportive of these causal effects, apart for MR-Egger for some stroke subtypes. Although the estimates for stroke were smaller than those for

CAD and confidence intervals were wider, the apparently weaker effect of lung function on stroke (compared with that observed for CAD) could be an underestimation because of selection bias. For example, if lung function is also related to survival then those who survive to have a stroke (which tend to occur at older ages than CAD) will likely be the ones with better lung function. Stroke shares several other risk factors, such as hypertension with CAD, but commonly occurs after CAD and this competing risk may attenuate or even reverse the estimates.<sup>7 38</sup> Further replication of our findings for stroke in Mendelian randomization studies ideally in cohorts with younger age at recruitment may better help elucidate the role of lung function in stroke.

The positive relation of lung function with atrial fibrillation in our main IVW analyses is somewhat unexpected given the majority of the findings from observational studies suggest an inverse relation although the association disappeared after adjusting for height.<sup>39</sup> Whilst the reason underpinning these changes is unclear, a recent Mendelian randomization study suggested taller people had higher risk of atrial fibrillation and hence failure to take into account height in the analyses may have led to the positive observed association in the main analyses given some of the lung function instruments were also related to height.<sup>40</sup> This may also explain the null findings upon adjustment for height in the multivariable Mendelian randomization.

In contrast to CAD and stroke, results for heart failure in the main analysis were very close to the null, which could suggest lung function is not causally related to heart failure. However, after adjusting for height, FEV<sub>1</sub> and FVC were possibly associated with lower risk of heart failure (Figures 1 and 2). Although this could be a reflection of

adjustment removing possible selection bias, reasons underpinning the differences would require further investigation.

Our study, using a design that is less likely to be confounded than conventional multivariable regression, indicates a possible role of lung function on cardiovascular health. From a clinical perspective, our results support further exploration of the effectiveness of monitoring cardiovascular and type 2 diabetes risk in patients with poor lung function. They also support interventions which improve lung function, such as tobacco cessation and increased physical activity, to prevent cardiovascular disease.

We have not been able to fully explore the relation of the FEV<sub>1</sub>/FVC ratio (a useful diagnostic marker of chronic obstructive pulmonary diseases)<sup>41</sup> with cardiovascular diseases or its risk factors. Nevertheless, exploratory analyses, using up to 97 SNPs strongly (p value  $<5x10^{-8}$  and main reported trait) and independently (r<sup>2</sup><0.001) associated with FEV<sub>1</sub>/FVC extracted from a recent GWAS (F statistic: 144),<sup>42</sup> suggested no strong evidence for an effect of FEV<sub>1</sub>/FVC on any of the outcomes (Supplemental Figures 9-10). However, the interpretation of the findings for FEV<sub>1</sub>/FVC ratio is potentially more challenging given any change in the ratio may also have reflected the varying magnitude of changes of both FEV<sub>1</sub> and FVC, which could have explained the differences with our main findings.

Although we used Mendelian randomization which is less susceptible to confounding by key traits, such as smoking, height and socio-economic position, there are some limitations. One of the limitations is that the validity of our study depends on the 3

main instrumental variable assumptions.<sup>5</sup> The F-statistics and proportion of variation in FEV1 and FVC make a major impact of weak instrument bias on our main IVW results unlikely, which if present, would bias our estimates towards the null for majority of the outcomes. Previous studies suggested possible biases related to the use of Wald ratio to estimate causal effects for disease outcomes.<sup>43</sup> However, we expected such biases would be small given the large sample sizes used. We also explored associations of instruments with confounders (e.g. smoking and height) which can constitute violation of the assumptions, where we found height as a main pleiotropic effect. Although consistent findings were observed using standard sensitivity analyses, we noticed attenuations of estimates for coronary artery disease upon adjusting for height in the multivariable Mendelian randomization. However, the degree of attenuation depends on the choice of GWAS where height instruments were extracted from (Supplemental Figures 1-8), which could possibly be a reflection of weak instrument bias and warrant further investigations. Another limitation is that we were unable to explore the possibility of non-linear effects between lung function and CVD, which can only be explored in one sample Mendelian randomization in large biobanks with individual level data. A final limitation is that we were unable to disentangle the independent effects of FEV1 and FVC on the outcomes. Whist exploratory analyses using multivariable Mendelian randomization suggested FVC may be more relevant than FEV<sub>1</sub> (Supplemental Figures 11-12), these results are susceptible to weak instrument bias (conditional F statistics <2.1 for both exposures) and so should be interpreted with caution.<sup>26</sup>

In conclusion, our Mendelian randomization study provides some evidence concerning the protective role of lung function on CAD, stroke, type 2 diabetes and

lower systolic blood pressure. Future studies should explore the underlying mechanisms, including the role of height in these relationships, and hence help identify additional targets of intervention for cardiovascular disease prevention. Future GWAS and Mendelian randomization studies exploring causes of hemorrhagic stroke are also important, particularly for settings where hemorrhagic stroke is prevalent, such as China.

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# Disclosure

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# Authors' contribution

SLAY designed the study, wrote the analysis plan and interpreted the results. SLAY undertook analyses with feedback from MCB, DAL, and CMS. SLAY wrote the first draft of the manuscript with critical feedback and revisions from MCB, DAL, and CMS. All authors gave final approval of the version to be published. SLAY had primary responsibility for final content.

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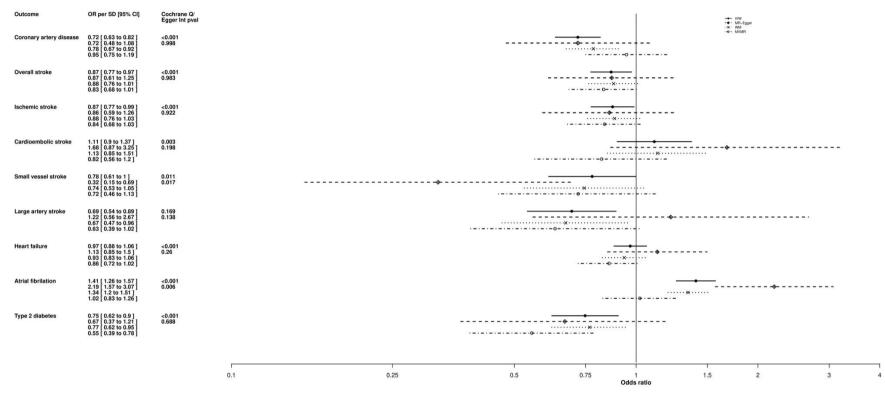
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Table 1: Data sources used in this N	iendellan randomizat		
		Sample size (%	
Exposure	Data source (PMID)	cases)	% European
Forced expiratory volume in 1 second	UK Biobank (IEU		
(SD)	GWAS)	421,986	100
	UK Biobank (IEU		
Forced vital capacity (SD)	GWAS)	421,986	100
<b>a</b> .		Sample size (%	
Outcomes	Data source (PMID)	cases)	% European
Concerns enterns disease	CARDIOGRAM	104 205 (220/)	
Coronary artery disease	(26343387)	184,305 (33%)	77
Stroke	MEGASTROKE	11C COC (00/)	100
Stroke	(29531354) MEGASTROKE	446,696 (9%)	100
Ischemic stroke		440 220 (00/)	100
Ischemic stroke	(29531354)	440,328 (8%)	100
Cardioembolic stroke	MEGASTROKE (29531354)	211 762 (20/)	100
	MEGASTROKE	211,763 (3%)	100
Small vessel stroke	(29531354)	100 010 (20/)	100
Sillali vessel stroke	MEGASTROKE	198,048 (3%)	100
Large artery stroke	(29531354)	150,765 (3%)	100
Atrial fibrillation	PMID: 30061737	1,030,836 (6%)	100
Heart failure	HERMES (31919418)	977,320 (5%)	100
Sustalia bland processes (SD)	UK Biobank (IEU	426 410	100
Systolic blood pressure (SD)	GWAS)	436,419	100
Diastolic blood pressure (SD)	UK Biobank (IEU GWAS)	436,424	100
· · · · · · · · · · · · · · · · · · ·	,	•	
LDL cholesterol (SD)	GLGC (24097068)	173,082	100
HDL cholesterol (SD)	GLGC (24097068)	187,167	100
Triglycerides (SD)	GLGC (24097068)	177,861	100
Glucose (mmol/L)	MAGIC (22581228)	58,074	100
HbA1c (%)	MAGIC (28898252)	123,665	100
Insulin (log)	MAGIC (22581228)	51,750	100
	DIAGRAM		
Type 2 diabetes	(28566273)	159,208 (17%)	100
Confounders	Data source (PMID)	Sample size	% European
Body mass index (SD)	GIANT (25673413)	339,224	95
Years education attained (SD)	SSGAC (27225129)	328,917	100
Alcohol (SD of Log transformed drinks	, , ,	, ,	1
per week)	GSCAN (30642351)	941,280	100
Smoking Heaviness (SD of cigarettes	. ,		1
per day)	GSCAN (30642351)	337,334	100
			100
Height (SD)	GIANT (25282103)	253,288	100

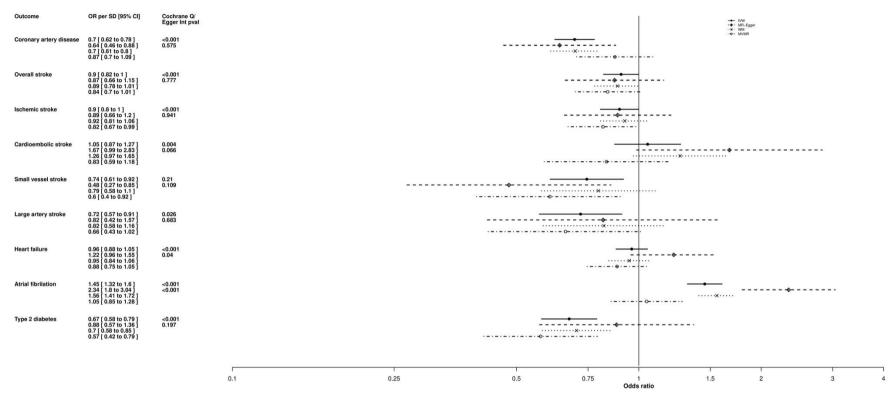
# Table 1: Data sources used in this Mendelian randomization study



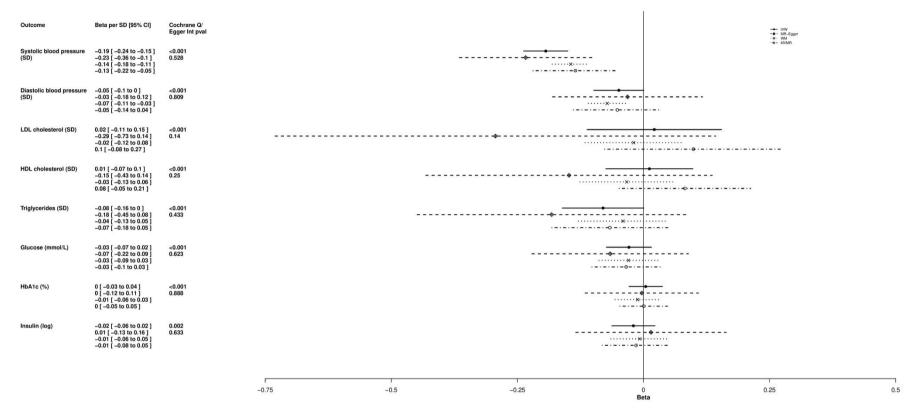


Footnote: \*IVW: Inverse variance weighting; WM: Weighted median; MVMR: Multivariable Mendelian randomization (Adjusted for height)

Figure 2: The impact of forced vital capacity (FVC, per SD) on cardiovascular disease and type 2 diabetes using Mendelian randomization



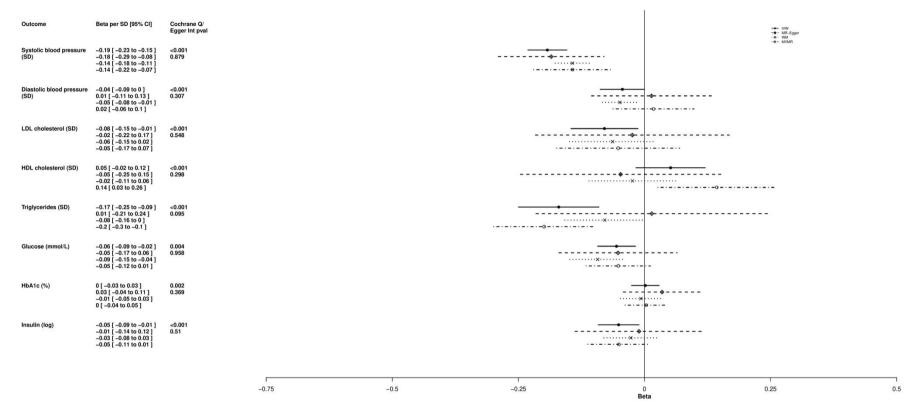
Footnote: \*IVW: Inverse variance weighting; WM: Weighted median; MVMR: Multivariable Mendelian randomization (Adjusted for height)



## Figure 3: The impact of forced expiratory volume in 1 second (FEV<sub>1</sub>, per SD) on cardiovascular risk factors using

## Mendelian randomization

Footnote: \*IVW: Inverse variance weighting; WM: Weighted median; MVMR: Multivariable Mendelian randomization (Adjusted for height)



## Figure 4: The impact of forced vital capacity (FVC, per SD) on cardiovascular risk factors using Mendelian randomization

Footnote: \*IVW: Inverse variance weighting; WM: Weighted median; MVMR: Multivariable Mendelian randomization (Adjusted for height)

Figure 5: The impact of higher predisposition to cardiovascular outcome on forced expiratory volume in 1 second (FEV<sub>1</sub>) and forced vital capacity (FVC) using Mendelian randomization

