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Aims

The aim of this study was to investigate the causal relationship and evidence of an association between increased adiposity and the risk of incident cardiovascular disease (CVD) events or mortality.

Methods and results

Observational (informing association) and Mendelian randomization (MR) (informing causality) studies were assessed to gather mutually complementary insights and elucidate perplexing epidemiological relationships. Systematic reviews and meta-analyses of observational and MR studies that were published until January 2021 and evaluated the association between obesity-related indices and CVD risk were searched. Twelve systematic reviews with 53 meta-analyses results (including over 501 cohort studies) and 12 MR studies were included in the analysis. A body mass index (BMI) increase was associated with higher risks of coronary heart disease, heart failure, atrial fibrillation, all-cause stroke, haemorrhagic stroke, ischaemic stroke, hypertension, aortic valve stenosis, pulmonary embolism, and venous thrombo-embolism. The MR study results demonstrated a causal effect of obesity on all indices but stroke. The CVD risk increase for every 5 kg/m² increase in BMI varied from 10% [relative risk (RR) 1.10; 95% confidence interval (CI) 1.01–1.21; certainty of evidence, low] for haemorrhagic stroke to 49% (RR 1.49; 95% CI 1.40–1.60; certainty of evidence, high) for hypertension. The all-cause and CVD-specific mortality risks increased with adiposity in cohorts, but the MR studies demonstrated no causal effect of adiposity on all-cause mortality.

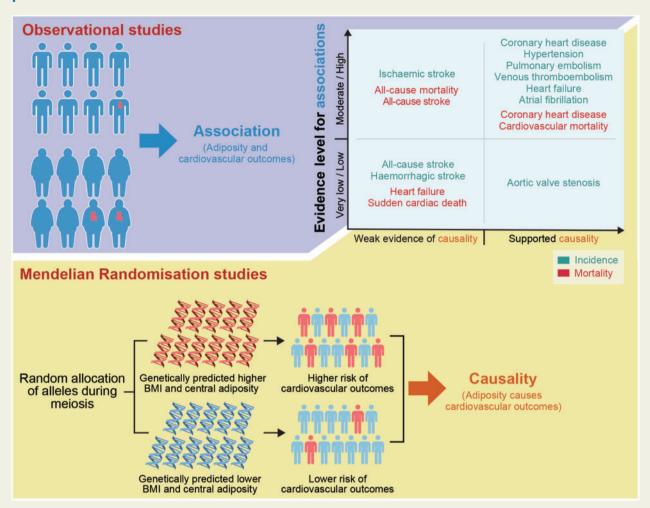
Conclusion

High adiposity is associated with increased CVD risk despite divergent evidence gradients. Adiposity was a causal risk factor for CVD except all-cause mortality and stroke. Half (49%; 26/53) of the associations were supported by high-level evidence. The associations were consistent between sexes and across global regions. This study provides guidance on how to integrate evidence from observational (association) and genetics-driven (causation) studies accumulated to date, to enable a more reliable interpretation of epidemiological relationships.

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Graphical Abstract



Observational studies (informing associations) and Mendelian randomization studies (informing causality) provided mutually complementary insight and enabled a more reliable interpretation of perplexing epidemiological relationships. This figure was constructed based on the summary of evidence shown in *Table 1*.

Keywords

Umbrella review • Meta-analysis • Mendelian randomization study • Cardiovascular disease • Coronary heart disease • Stroke

Introduction

Cardiovascular diseases (CVD) account for over two-thirds of deaths attributable to a high body mass index (BMI), ¹ and the consequential health outcomes constitute a major proportion of health-related economic burden worldwide. ^{2–6} Despite countermeasures, the outlook is unfavourable, and the incidence of CVD is expected to increase over the next few decades, especially in low- and middle-income countries, as the average BMI increases. ⁷ The association between adiposity and CVD has been extensively studied for decades using Mendelian randomization (MR) ^{8,9} and observational study designs. ^{10,11,12} However, the evidence to date has focused on single

clinical associations, leaving evidence on the association between adiposity and multiple cardiovascular outcomes (e.g. stroke, heart failure, atrial fibrillation) unconsolidated.

Umbrella reviews have been increasingly conducted to consolidate the highest level of evidence, namely systematic reviews and meta-analyses, on a given topic. ^{13,14} The most notable difference between a conventional meta-analysis and an umbrella review is that the former uses results from the original study as a fundamental unit for analysis, while the latter uses the results of previous meta-analyses. The umbrella review unites previously published systematic reviews or meta-analyses that usually examine a single clinical association (e.g. adiposity and stroke), systematically

merges them to produce multiple clinical endpoints, and provides a bird's-eye view of a given topic (e.g. adiposity and several CVD). This umbrella review process involves extensive statistical replication and updating of previous meta-analyses using a uniform analytic model and framework to align and directly compare the relevant information. This aspect is a unique strength of the umbrella review in that it enables the consistent and comparative assessment of multiple biases for all relevant outcomes and allows the stratification of findings into distinct evidence levels. Therefore, umbrella reviews help discriminate between mature and immature findings and provide the highest level of evidence to guide decision-making. The several comparative assessment of multiple biases for all relevant outcomes and allows the stratification of findings into distinct evidence levels. Therefore, umbrella reviews help discriminate between mature and immature findings and provide the highest level of evidence to guide decision-making.

Given that the association between adiposity and CVD outcomes is an epidemiological topic, randomized controlled trials (RCTs) are rarely possible, preventing the elucidation of causal inferences. As an alternative to RCTs, MR studies have been increasingly applied to strengthen causal inferences about associations in observational research.¹⁷ The present study is the first to incorporate MR studies into the body of evidence of observational studies and construct an association-to-causality evidence map to aid the more reliable interpretation of epidemiological relationships. This umbrella review accrued a vast amount of relevant evidence on the association between obesity indices and CVD. The results from recently published cohort studies were manually incorporated into existing meta-analyses to update previous results, and over 501 cohorts and 30 million participants were integrated for quantitative syntheses. This work may help contextualize the magnitude of the association and explain the causality of obesity in CVD.

Methods

Literature search and selection criteria

We systematically searched Google Scholar, PubMed, Embase, and the Cochrane Database of Systematic Reviews for systematic reviews and meta-analyses that investigated the association between adiposity indices and cardiovascular health outcomes from inception to 28 January 2021. The adiposity indices of interest included BMI, waist circumference (WC), and waist-to-hip ratio (WHR). We used a predefined search strategy outlined in the Supplementary material online, *Appendix* for the initial search and replicated it using a search strategy developed by an experienced librarian. We also performed extensive manual searches of the reference lists of the retrieved review articles to identify additional studies. Observational studies were collected to update previous meta-analyses, while MR studies were incorporated to evaluate causality as described in previous umbrella reviews. ^{18,19} We imposed no language restrictions, but all included studies were written in English. The study protocol was published in PROSPERO (CRD42020179469).

Inclusion and exclusion criteria

We included systematic reviews and meta-analyses of prospective cohort studies as well as MR studies that explored the association between obesity indices and cardiovascular outcomes using genetic instruments (GI). We excluded systematic reviews and meta-analyses that evaluated indices other than BMI, WC, and WHR, such as weight loss %, history of bariatric surgery, and adipose tissue volume, as they can increase heterogeneity and hinder a valid synthesis of the results. Studies that included a specific population, such as patients who underwent percutaneous coronary intervention or coronary artery bypass graft or patients who had CVD outcomes of interest [e.g. coronary heart disease (CHD), atrial

fibrillation] at baseline were excluded. Studies involving animal or *in vitro* experiments were excluded.

Data extraction

Two researchers (M.S.K. and W.J.K.) independently searched the existing literature and extracted the data. The titles, abstracts, and keywords of each study were reviewed for inclusion, and any ambiguity was resolved through discussion. The study selection process was recorded using the PRISMA flowchart (*Figure 1*).²⁰

The data were collected using a predefined template. The following details were obtained from the included systematic reviews and meta-analyses of observational studies: publication year, number of studies included in the meta-analysis, exposures, comparisons, number of cases and participants, study design, model of effect estimation (random or fixed effects), heterogeneity, and maximally adjusted effect size with 95% confidence interval (CI) for each study (Supplementary material online, Tables S1 and S2). Both categorized (overweight, obese, and severely obese) and continuous (per increase in BMI, WC, and WHR) measures were extracted for qualitative synthesis. From the MR studies, we extracted data on exposure, sample size, instrumental variable method, GI, variance (R^2) explained by GI, and maximally adjusted effect estimates with 95% CI (Supplementary material online, Table S3). Mendelian randomization assumptions regarding the reliability of GI (assumption 1) and absence of pleiotropic effects (assumption 2) were evaluated as shown in Supplementary material online, Table S4. 21,22

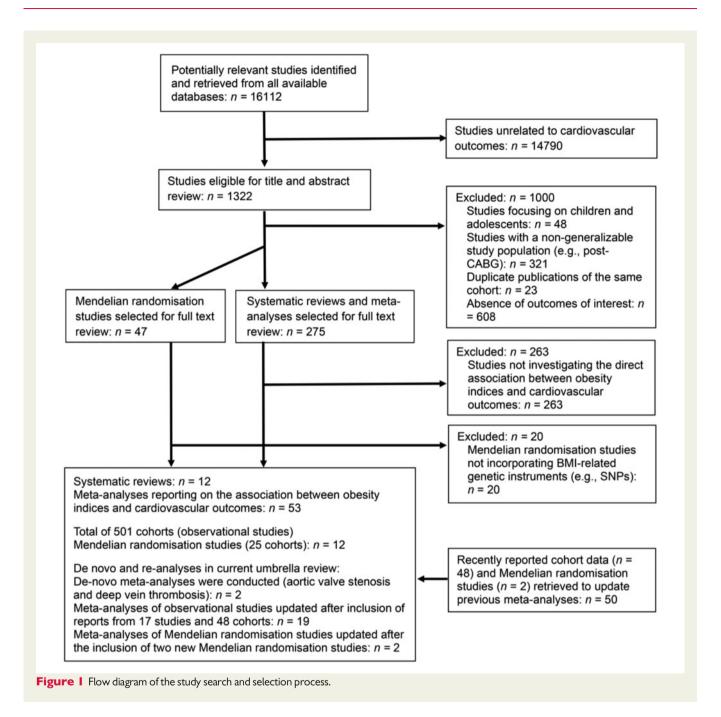
Data analysis

We replicated the meta-analyses and re-analysed the data to uncover the non-explicit details of these meta-analyses necessary to evaluate the relevant biases that were subsequently used to assess the certainty of evidence. The following items were considered to assess bias: heterogeneity among studies using the l^2 metric²³; the presence of publication bias and small study effect using Egger's tests (significance threshold, P < 0.10)²⁴; p-curve test detecting p-hacking^{25–28}; and 95% prediction intervals, representing the range within which the effect estimates of future studies will lie with 95% certainty.^{29–31}

We conducted a pairwise meta-analysis using the 'meta' package of R (version 3.6.0) software³² to re-analyse and update previous metaanalyses with recently published observational studies. The results are reported in Supplementary material online, Figures S2-S41. We re-analysed and updated previously reported meta-analyses using a generic inverse variance method. For the de novo meta-analysis, the generic inverse variance method was applied to incorporate adjusted results [e.g. adjusted relative risk (RR)] that could not be presented in the dichotomous data (numbers of events and totals). For both reanalysis and de novo meta-analysis, we applied the Hartung-Knapp-Sidik-Jonkman random-effects model since heterogeneity (I^2) was generally high and the number of studies was small for multiple outcomes.33,34 We applied a random-effects model because the intergroup heterogeneity was less likely to be introduced by chance. Further details of the methodology and our analytic workflow for pairwise meta-analyses are described elsewhere. 35-37 The summary of the effect estimation metrics [odds ratio (OR), RR, and hazard ratio (HR)] presented by each study is shown in Supplementary material online, Table S2.

Subgroup analysis

Pre-specified subgroup analyses were performed to determine whether the results were affected by BMI categories or sex. We conducted a reanalysis by global region at the individual study level to observe global patterns and variations. Since few studies provided individual study data, no



bias analysis could have been performed, and regional analyses were not included for evidence classification. We did not conduct subgroup analyses of cohort vs. case-control studies, as all of the included meta-analyses analysed cohort studies. When multiple effect metrics were reported from numerous studies, the effects were pooled regardless of the metrics; however, subgroup analyses for each metric were conducted to evaluate the difference.

Evaluation of the certainty of evidence

We incorporated the MR studies into the body of evidence from the observational studies and constructed an association-to-causality evidence

map to enable a more reliable interpretation of the epidemiological relationship. We reviewed any discordance between the observational studies and MR analyses (*Table 1*). We assessed the certainty of evidence for all reported associations from the observational and MR studies using the Grading of Recommendations Assessment, Development, and Evaluation (GRADE) framework.³⁸

The GRADE framework accounts for study limitations, risk of bias, imprecision, indirectness, inconsistency, publication bias, large magnitude of effect, and dose-response associations. For the study design in the GRADE framework, we assigned the high level for MR studies given that RCTs are rarely possible for non-interventional epidemiological topics and MR studies are usually deemed as an alternative to RCTs for such

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Main outcomes	Equivalen	Equivalent body fat ^a	Cen	Central adiposity ^a	Concordance	Summary of	Interpretations and proposals for future
	BMI category	BMI continuous (per unit increase)	×	WHR	(between observational and MR studies) ^b	evidence ^a	study
Risk for mortality	-					-	
All-cause mortality	I loderate for	- High for hon-			NO (not significant	l'ioderate to nign;	Results from meta-analyses of observational studies
	overweight	smokers			on MR study)	no causality	indicate an association; results of MR studies
	 Moderate for 	Low for all				supported by	infer causality. Collective evidence suggested that
	opese	population				MR study.	adiposity may not be a causal risk factor for all-
	 High for severely 					Requires cau-	cause mortality despite solid associations with
	opese					tions	moderate to high certainty of evidence. Given
						interpretation	that adiposity is a causal risk factor for CVD
							mortality, it is plausible that CVD mortality acted
							as a mediator between adiposity and all-cause
							mortality and complicated a thorough inspection
							of the actual relationship. Quantitatively synthe-
							sized evidence of the association between cen-
							tral adiposity (WC and WHR) and all-cause
							mortality is lacking, and future studies are
							required.
Heart failure	I	Not significant (very	I	1	MR study not	Very low	Heart failure-related death may have a very weak
		low)			reported		link with adiposity. Magnitude of the association
							and causality remains unsupported.
Coronary heart	I	High	I	1	Yes	High, with causal-	Increased BMI is a causal risk factor for CHD mor-
disease						ity supported	tality. However, to date, the association between
						by MR study	CHD mortality and central adiposity (measured
							by WC and WHR) was studied at the individual
							study level, not in systematic reviews and meta-
							analyses; quantitative synthesis of evidence
							should be followed with the further accumula-
							tion of collective data.
Cardiovascular	I	High	I	1	Yes	High, with causal-	The increase in BMI causes and escalates overall
disease						ity supported	cardiovascular mortality. However, the associ-
						by MR study	ation between CVD mortality and central adi-
							posity (WC and WHR) is subject to future
							studies. It requires a further accumulation of

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	Equivalent	Equivalent body fat	ָ כ	Central adiposity	Concordance	Summary of	interpretations and proposats for facility
	BMI category	BMI continuous (per unit increase)	υ >	WHR	(between ob- servational and MR studies) ^b	evidence"	study
							collective data (in systematic reviews and meta-
							analyses).
All-cause stroke	1	High		1	No (not significant	High, without	MR study suggested no causal effect of adiposity on
					in MR study)	causality sup-	stroke-specific mortality; the result contradicts
						ported by MR	those of meta-analyses of observational studies.
						study. Requires	While adiposity may be associated with stroke
						cautious	death to some degree, more extensive studies
						interpretation	may be required to resolve the disparity be-
							tween the results of observational and MR stud-
							ies. Prospective investigations on central
							adiposity (WC and WHR) will provide novel in-
							sight into the aetiology of stroke and stroke-spe-
							cific death.
Sudden cardiac	Low for	1		1	MR study not	Low level of evi-	There is weak evidence that body fat increases the
death	Overweight				, renorted	dence from ob-	, risk of sudden cardiac death and the causal rela-
	• Low for obese					servational	tionship remains unknown: firture MR studies can
						studies; MK	elucidate the causality. The association between
						study not	sudden cardiac death and central adiposity (WC
	ļ					reported.	and WHR) will be the subject of future studies.
Kisk for developing CVD	CVD						
Coronary heart	 Very low for 	High	I		Yes	Moderate in gen-	Collective evidence suggests that the increase in
disease	overweight					eral, with caus-	BMI is a causal risk factor for developing CHD.
	 Moderate for 					ality supported	An association between the risk of CHD and
	opese					by MR study	central adiposity (WC and WHR) is the subject
							of a quantitative synthesis.
All-cause stroke	 Not significant for 	Low		1	Yes ^c	Low, without	Adiposity may not cause an all-cause stroke.
	overweight (low)				(not significant in	causality sup-	Magnitude of association and certainty of evi-
	 Very low for obese 				both observa-	ported by MR	dence for the association were weak. An associ-
					tional and MR	study	ation between the risk of all-cause stroke and
					studies)		central adiposity (WC and WHR) is subject to
							quantitative synthesis.
Haemorrhagic	I	Low		1	No (not significant	Low, without	The MR study suggested no causal effect of adipos-

BMI category Ischaemic stroke —	BMI continuous (per unit increase)					
Ischaemic stroke —		>	WHR	(between observational and MR studies) ^b	evidence ^a	study
schaemic stroke —					supported by	contradicts those of reports from the meta-anal-
Ischaemic stroke —					MR study	yses of observational studies. It should be noted
schaemic stroke —						that the association was borderline significant on
Ischaemic stroke —						the observational basis, and the directions of the
Ischaemic stroke —						adiposity effect on haemorrhagic stroke were
Ischaemic stroke —						opposite in Europe/North America/Australia vs.
Ischaemic stroke —						Asia, which further weakens the significant asso-
Ischaemic stroke —						ciations described in the meta-analysis of obser-
Ischaemic stroke —						vational studies. It would be more reasonable
Ischaemic stroke —						considering that data from observational studies
Ischaemic stroke —						and MR studies are in concord against the associ-
Ischaemic stroke —						ation. An association between the risk of haem-
Ischaemic stroke —						orrhagic stroke and central adiposity (WC and
Ischaemic stroke —						WHR) will be the subject of future studies.
	High	I	1	No (not significant	High, without	The MR study suggested no causal effect of adipos-
				in MR study)	causality sup-	ity on ischaemic stroke; this result contradicts
					ported by MR	those of the reports from the meta-analyses of
					study	observational studies. While adiposity may be
						associated with ischaemic stroke to some de-
						gree, more extensive studies may be required to
						resolve the disparity. The findings indicated that
						ischaemic stroke is more likely to be associated
						with adiposity than haemorrhagic stroke, which
						may suggest the underlying mechanism of the
						adiposity effect on stroke outcomes. Prospective
						investigations on the association between central
						adiposity and the risk of ischaemic stroke are
						necessary.
Heart failure • Not significant for	, High	High	Moderate	Yes	Heterogeneous	Concerning the high level of evidence of the associ-
overweight (very					for BMI, gener-	ation between continuous BMI and heart failure,
low for obese					central adinos-	rie association fingir indicate the dose't espois
					ity; causality	weak evidence level of the association between

Main outcomes	Equivalen	Equivalent body fat ^a	Ö	Central adiposity ^a	Concordance	Summary of	Interpretations and proposals for future
	BMI category	BMI continuous (per unit increase)	∨	WHR	(between observational and MR studies) ^b	evidence".	study
	 Not significant for severe obese (very low) 					supported by MR study	categorical BMI and heart failure might imply that the association is weak or inconclusive. Given the small number of studies investigating the association (≤10 studies), the latter would be
							more likely. Heterogeneous results across diverse adiposity indices complicate the interpretation and clarification of the association. Further studies should be performed to increase the
Atrial fibrillation	Moderate for obese	High	High	Not significant (low)	≺es	Generally high, with causality supported by MR study	Collective evidence suggested that adiposity is a causal risk factor for developing atrial fibrillation. Of note, two central adiposity indices (WC and WHR) provided contradictory results, which should be addressed in future studies. This dis-
							crepancy may be partially attributable to the small number of studies; thus, an updated metananalysis is necessary.
Aortic valve stenosis	Low for obese	I	I	I	Yes	Low, with causality supported by MR study	An increased BMI was associated with an increased risk of developing AVS. However, the magnitude of the association indicated by the meta-analysis
							of observational studies should be interpreted with caution due to the small sample sizes and cohorts. A prospective updated meta-analysis incorporating a larger number of studies is warranted. Moreover, evidence of the association between central adiposity (WC and WHR) and AVS is lacking, implying that this area requires future investigation.
Hypertension	I	High	High	High	≺es	High, with causality supported by MR study	The collective evidence suggested that adiposity is a causal risk factor for developing hypertension. The findings of equivalent body fat (BMI) and central adiposity (WC and WHR) consistently support this association. Both BMI and central

Table I Continued	pən						
Main outcomes	Equivaler	Equivalent body fat ^a	Centra	Central adiposity ^a	Concordance	Summary of	Interpretations and proposals for future
	BMI category	:	۷ ۸	WHR	(between observational and MR studies) ^b	evidence ^a	study
							adiposity may be reliable indicators for measur-
							ing risk and understanding the aetiology of
							hypertension.
Pulmonary	High for obese	1			Yes	High, with causal-	Adiposity might be a causal risk factor for develop-
embolism						ity supported	ing PE. An association between the risk of PE and
						by MR study	central adiposity (WC and WHR) will be the
							subject of future studies.
Venous thrombo-	Moderate for obese	1			Yes	Moderate, with	Adiposity is likely a causal risk factor for developing
embolism						causality sup-	VTE. For both PE and VTE, collective evidence of
						ported by MR	the effect of increased central adiposity (WC
						study	and WHR) is lacking.

GRADE (Grading of Recommendations, Assessment, Development, and Evaluation): High: The evidence provides a very good indication of the likely effect; the likelihood that the effect will be substantially different is low. Moderate: The evidence provides a good indication of the likely effect; the likelihood that the effect will be substantially different is moderate. Low: The evidence provides some indication of the likely effect; however, the likelihood that the effect on a decision) is high. Very low: The evidence does not provide a reliable indication of the likely effect; the likelihood that the effect will be substantially different (a large

AVS, aortic valve stenosis; BMI, body mass index; CHD, coronary heart disease; CVD, cardiovascular disease (including CHD and stroke); MR, Mendelian randomization; PE, pulmonary embolism; VTE, venous thrombo-embolism; WHR, waist-to-hip ratio; WC, waist circumference.

^aHigh, moderate, low, and very low include outcomes with statistical significance.

Presults from meta-analyses of observational studies indicate an association, while results of MR studies suggest causality.

The association between BMI and the risk of stroke in overweight populations reported in observational studies and the risk of stroke reported in Mendelian randomization studies are consistently not significant...

topics 17,21; we assigned a moderate level for large prospective cohort studies and a low level for retrospective studies, since numerous studies suggested a differentiation of evidence levels between prospective and retrospective cohort studies.^{39–41} The small study effects were judged by the GRADE's imprecision and publication bias evaluation.⁴² The risk of bias evaluation was tailored for observational and MR studies because the study designs involved different biases. Observational studies are more susceptible to confounding, reverse causation, and selection biases, while MR studies are more commonly affected by weak instrument bias and pleiotropic effects.^{21,43} The risk of bias was evaluated using the Newcastle-Ottawa scale (NOS)⁴⁴ for observational studies and a modified NOS for MR studies. The evaluation of all other components of GRADE was adhered to the guideline.⁴⁵ The 53 previously reported associations were classified according to the GRADE framework and are presented as evidence maps (Graphical abstract and Table 1). Further methodological details are provided in the Methods section of the Supplementary material online.

Results

Literature review

Of the 16 112 studies identified in the reviewed databases, 1322 were eligible for title and abstract review. After the exclusion of 1000 studies that met our pre-specified exclusion criteria, 275 systematic reviews with meta-analyses and 47 MR studies were subjected to full-text review. The full-text review led to the exclusion of 283 further studies; thus, 12 systematic reviews and 53 meta-analyses of over 501 non-overlapping cohort studies and 12 MR studies (25 cohorts) were included in the final analyses. The PECO (population, exposure, comparison, and outcome) of the included studies were as follows: meta-analyses investigated the impact of increased adiposity (E) vs. normal condition (C) on the risk of CVD outcomes (O) in the general population (P). The search and selection processes are presented in *Figure 1*. The inclusion/exclusion criteria and adjustment profiles of the included meta-analyses are summarized in Supplementary material online, *Table S9*.

Meta-analyses of observational studies

All but 6 of the 53 associations were statistically significant according to the random-effect model results (Supplementary material online, Table S7). The increase in the risk of developing CVD for every 5 kg/ m² increase in BMI varied from 10% (RR, 1.10; 95% CI, 1.01–1.21; certainty of evidence, low) for haemorrhagic stroke to 49% (RR, 1.49; 95% Cl, 1.40-1.60; certainty of evidence, high) for hypertension (Figure 2A). The risk of cardiovascular events was increased in the overweight population (BMI > $25-30 \text{ kg/m}^2$) vs. the reference group with normal BMI values (HR, 1.14; 95% CI, 1.08-1.20; certainty of evidence, very low for CHD, and RR, 1.18; 95% CI, 1.00-1.40; certainty of evidence, low for sudden cardiac death) (Figure 2A). The risk of developing CVD was increased in the obese population (BMI > 30–35 kg/m²) compared with the normal group (HR, 1.16; 95% CI, 1.04–1.28; certainty of evidence, very low for all-cause stroke to HR, 2.24; 95% CI, 1.73-2.90; certainty of evidence, high for pulmonary embolism) (Figure 2A). The risk of mortality for every 5 kg/m² (BMI) increment was escalated to divergent extents (RR, 1.05; 95% CI, 1.02-1.07; certainty of evidence, low for all-cause

mortality to HR, 1.49; 95% Cl, 1.45–1.53; certainty of evidence, high for CVD mortality) (*Figure 2B*).

Mendelian randomization studies

A total of 12 MR analyses (25 cohorts) were identified and classified into 22 outcomes (Supplementary material online, *Table S3*). The proportion of variance (*R*²) explained by GI was 1.6–1.82%. Thirteen of the 22 outcomes were supported by a statistical power greater than 80%. All but transient ischaemic attacks (TIAs) and CHD (per 1kg/m²) met the MR assumptions. Every 1kg/m² increment in BMI was associated with an increased risk of pulmonary embolism, CHD, peripheral artery disease, atrial fibrillation, hypertension, deep vein thrombosis, heart failure, and aortic valve stenosis (*Figure 3A*); every 5kg/m² increment in BMI was associated with an increased risk of CHD, peripheral artery disease, hypertension, and heart failure (*Figure 3B*); and every 1kg/m² increment in BMI was associated with an increased risk of death from CVD and CHD (*Figure 3C*).

Subgroup analyses

The associations of CVD outcomes with other adiposity measures, including WC and WHR, were consistent with those of BMI (*Figure 4A*). The risk of CVD outcomes showed a dose-dependent increase with a stepwise increase in BMI categories (*Figure 4B*). Obese men had a higher risk of CVD than obese women (*Figure 4C*), but the difference was not statistically significant except for all-cause mortality. According to the regional analysis (*Figure 5*), European and Asian populations were prone to greater cardiovascular mortality per 5 kg/ m² increase in BMI than North American populations. While the overall patterns were consistent for diverse cardiovascular phenotypes, the associations were heterogeneous for stroke among regions.

Level of evidence

The certainty of evidence derived from the observational and MR studies was evaluated using the GRADE framework (Supplementary material online, Tables S5 and S6). Of the 53 meta-analyses that investigated the effect of obesity on CVD-related outcomes, 26 associations (49%) were supported by high evidence certainty (GRADE) as described in the evidence map (Supplementary material online, Table 57). The MR study results were more likely to be susceptible to the small study effects than the observational study results; along with the absolute smaller sample sizes of the MR studies, according to the GRADE evaluations, 50% (11/22) of all outcomes derived from the MR studies were imprecise (Supplementary material online, Table S6) vs. only 20% (11/53) of all outcomes derived from the observational studies (Supplementary material online, Table S5). To avoid reverse causation bias, concordance between the observational and MR analyses results in the direction and/or the statistical significance of associations was reviewed and summarized in Table 1. The quality of the included meta-analyses evaluated using the AMSTAR2 tool was generally moderate (Supplementary material online, Table S8).

Discussion

This umbrella review provides a comprehensive overview of the existing evidence on the association between obesity and CVD by

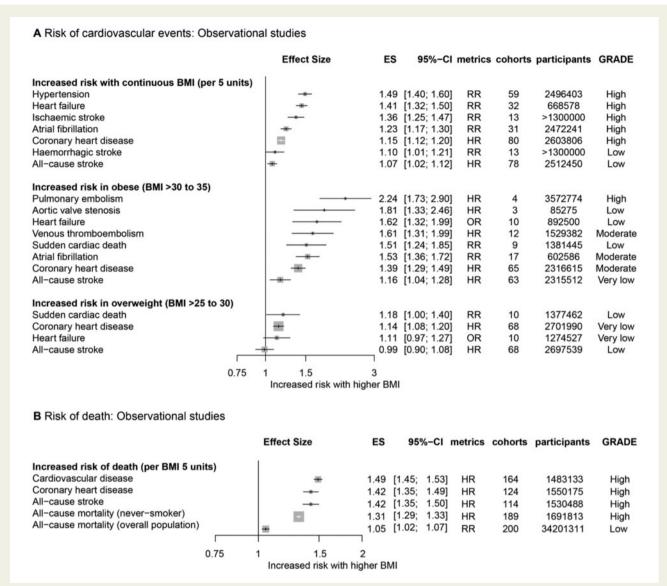
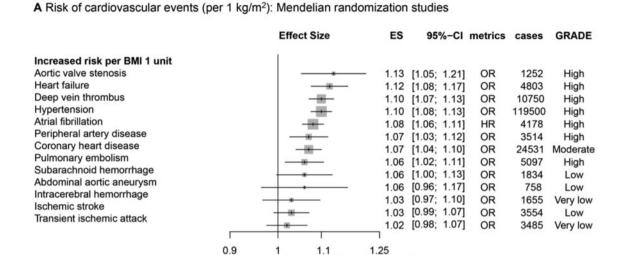


Figure 2 Collective results of observational studies. (A) Increased risk of cardiovascular events with elevated continuous and categorical body mass index. (B) Increased risk of death with elevated continuous body mass index. All results are based on random-effect models. The cohort and participant columns display the number of independent cohorts and the total number of participants incorporated in the meta-analysis for the outcome. The certainty of evidence underlying each association between body mass index and cardiovascular outcomes was evaluated using the GRADE framework. BMI, body mass index; ES, effect size; GRADE, Grading of Recommendations Assessment, Development, and Evaluation; HR, hazard ratio; OR, odds ratio; RR, risk ratio or relative risk.

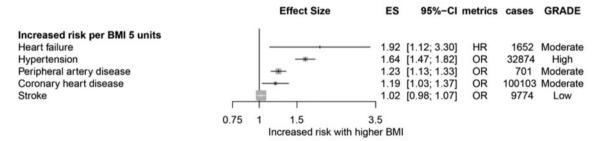
stratifying the association between obesity and each CVD outcome into distinct evidence levels. Twelve systematic reviews with 53 meta-analyses comprising over 501 cohorts and 30 million participants were subjected to a quantitative synthesis and quality assessment. As observational studies can suggest an association but are unable to make claims about causation, MR studies were included to determine causality. Therefore, we provide results from observational and MR studies in parallel to contextualize both the magnitude of association and the causality. The novel findings and insights provided by this umbrella review are summarized in *Table 1*. This work is a landmark study in that it provides guidance on how to integrate

evidence from observational and genetics-driven studies accumulated to date to enable a more reliable interpretation of epidemiological relationships.

We also re-analysed all published data to uncover the non-explicit details, particularly the heterogeneous impact of adiposity among various global regions. To the best of our knowledge, this is the first region-specific quantitative synthesis of all cardiovascular outcomes relative to adiposity. The overall patterns were consistent across regions for diverse cardiovascular phenotypes; however, there were some exceptions; for example, European and Asian populations showed greater increases in cardiovascular death risk per 5 kg/m²



B Risk of cardiovascular events (per 5 kg/m²): Mendelian randomization studies



Increased risk with higher BMI

C Risk of death (per 1 kg/m²): Mendelian randomization studies

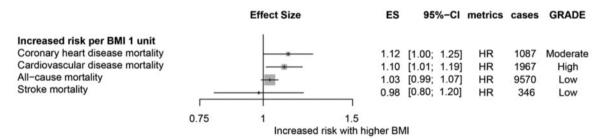


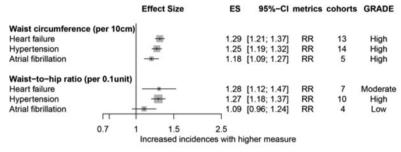
Figure 3 Collective results of Mendelian randomization studies. (A) Increased risk of cardiovascular events per 1 kg/m^2 increase in body mass index. (B) Increased risk of cardiovascular events per 5 kg/m^2 increase in body mass index. (C) Increased risk of death per 1 kg/m^2 increase in body mass index. All results are based on random-effects models. The cohort and cases columns display the number of independent cohorts and the number of cases incorporated in the meta-analysis for the outcome. BMI, body mass index; ES, effect size; HR, hazard ratio; OR, odds ratio; RR, risk ratio or relative risk.

increase in BMI than North American populations. In addition, the associations of BMI with stroke were heterogeneous among regions, particularly for haemorrhagic stroke risk.

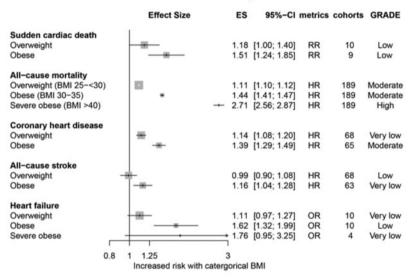
An increase in BMI was associated with a higher risk of developing all specific CVD; risks of CHD, heart failure, atrial fibrillation, all-cause stroke, haemorrhagic stroke, ischaemic stroke, hypertension, aortic

valve stenosis, pulmonary embolism, and venous thrombo-embolism increased with BMI in observational studies (informing association), consistent with MR study results (informing causality) with the exception of stroke (*Figures 2 and 3*). In our subgroup analyses, the risk of developing CVD showed a proportional and dose-dependent increase with a step-up in BMI categories, and obese men were more





B Risk of cardiovascular diseases with increase in categorical BMI



C Risk of cardiovascular diseases with increase in BMI by sex

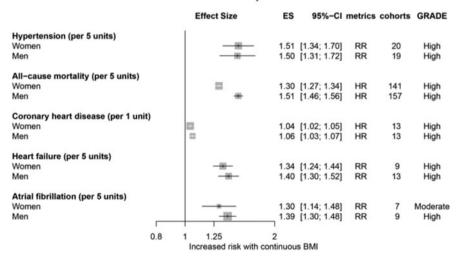


Figure 4 Subgroup analyses of risk of cardiovascular diseases for central adiposity (A), categorical body mass index (B), and sex (C). All results are based on random-effects models. The cohort and participant columns display the number of independent cohorts and the total number of participants incorporated in the meta-analysis for the outcome. The certainty of evidence was evaluated using the GRADE framework. BMI, body mass index; GRADE, Grading of Recommendations Assessment, Development, and Evaluation; RR, risk ratio or relative risk.

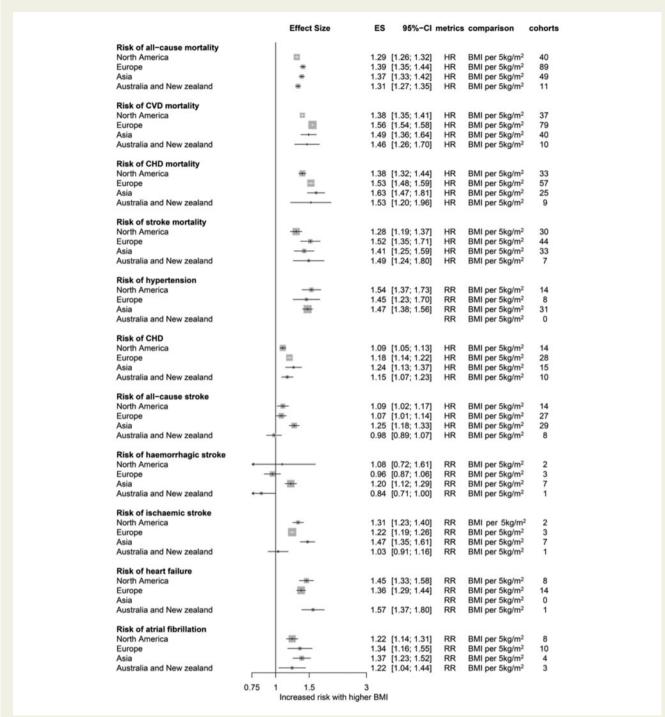


Figure 5 Risks of cardiovascular incidences and mortalities were re-analysed according to regions. BMI, body mass index; CVD, cardiovascular disease; CHD, coronary heart disease; ES, effect size; HR, hazard ratio; OR, odds ratio; RR, risk ratio or relative risk.

prone to unfavourable CVD outcomes than obese women (Figure 4), although the difference was not statistically significant. The associations between CVD outcomes and other adiposity measures, including WC and WHR, were consistent with those for BMI.

Of note, all-cause mortality significantly increased with higher BMI in observational analyses, although this association was not significant

in the MR analyses (*Table 1*). Such discordance may be explained by the intrinsic limitations of observational studies in managing living confounders. Although a significant association between obesity and all-cause mortality rate was observed in more than 200 collective cohorts with adjustments for age, sex, and smoking, ⁴⁶ this association should be interpreted cautiously as the association may involve

residual confounding factors such as diverse comorbidities such as diabetes mellitus and dyslipidaemia; Aune et al.⁴⁶ reported significant associations between adiposity and all-cause mortality in crude analysis, but not in sensitivity analyses that adjusted for such potential intermediate traits (Supplementary material online, *Table S9*). It is plausible that the observational results of all-cause mortality may have been overestimated by comorbidities and other intermediate or surrogate causes for death in cohorts that are not necessarily driven by cardiovascular impairment.

Several points should be considered for the proper interpretation of the MR results. Mendelian randomization studies rely on certain assumptions, 21,22 of which that regarding horizontal pleiotropy is known to be the most challenging to address. The horizontal pleiotropic effect represents the effects of GI (e.g. variants) on multiple biological pathways, which confounds interpretation of the MR results. 17,21 We checked for the assumptions for each MR study and confirmed that no horizontal pleiotropy was suspected with all but TIA and CHD (per 1 kg/m² increase) (Supplementary material online, Table S4). However, this does not necessarily weaken our analyses; although an MR result for TIA was reported in this review, it was not used in the interpretation (Table 1) since TIA was not investigated in observational studies; while CHD (per 1 kg/m² increase) was at risk of pleiotropy, CHD (per 5 kg/m² increase) still met the assumptions, and because both CHD MR results similarly supported positive causation of adiposity on CHD, it is less likely to alter the interpretations.

For the MR analysis, Wade et al. 47 used the polygenic risk score (PRS), comprising 77 single nucleotide polymorphisms associated with BMI as reported in the Genetic Investigation of Anthropometric Traits (GIANT) consortium, as the GI, which explained 1.82% of the variance (equivalent to at least >60 in F-statistics). The proportion of variance (R^2) explained by the GI was deemed acceptable, as it was >10 in F-statistics, ^{21,48–50} and the explanatory power of PRS for obesity was deemed reliable.⁵¹ While there are some limitations to the MR approaches incorporated in our study, such as potential pleiotropic effect (e.g. TIA) and limited statistical power for certain CVD phenotypes (Supplementary material online, Table S3), 22,52 it is likely that any potential biases are less marked than those of observational studies⁴⁷ because the assumptions for MR were generally met.²¹ The triangulation of different methodologies is essential for inferring definite conclusions with proper causal inference, 47 and the findings from the MR studies may add to the current body of evidence implicating obesity as a risk factor for cardiovascular health outcomes.

The risk of the incidence of all CVDs except stroke was significantly increased with obesity in both observational and MR analyses (Figures 2 and 3). A large number of mediators released by the adipose tissue may play a key role in the link between obesity and CVD. Adipose tissues release bioactive mediators that influence alterations in lipids, coagulation, fibrinolysis, and inflammation, leading to endothelial dysfunction and atherosclerosis. Atherosclerosis is the principal origin of CVD 54,55; it synergistically interacts with hypertension, and both factors aggravate one another. It is notable that hypertension was the most vulnerable entity affected by BMI in our analysis; the increase in the risk of developing CVD for every 5 kg/m² increase in BMI ranged from 10% (RR, 1.10; 95% CI, 1.01–1.21) for haemorrhagic stroke to 49% (RR, 1.49; 95% CI, 1.40–1.60) for hypertension. Other CVDs may be the consequence of atherosclerosis and

hypertension, as these entities possibly represent a pathophysiological basis and are thus major risk factors for CVD. 55,57-60

Several MR studies have reported that BMI has no causal effect on stroke, 61-63 and stroke was the least affected entity in our analysis. This result corroborates that of a recent study conducted by Khera et al.51 in which stroke occurred less frequently than most other CVDs, such as hypertension and venous thrombo-embolism, in high BMI PRS carriers (10th percentile); this observation probably indicates that the genetic drivers for obesity have a weak causal effect on the development of stroke. The discordance in the results of observational and MR analyses for stroke (Table 1) in our umbrella review may suggest that stroke pathophysiology involves a complex mechanism in which obesity is only a minor part.⁶⁴ Other explanations for the discordance include the possible heterogeneous interactive effects of different adiposity measures (e.g. BMI and fat mass index) and stroke subtypes; for example, a positive association of fat mass index with ischaemic stroke, but not haemorrhagic stroke, was reported by an MR study.⁶⁵

Obesity is a multifactorial disease that results from interactions between genetics and lifestyle. 66,67 The heritability for obesity is known to be around 40%, 66,68 while the remainder can be explained by lifestyle factors, which suggests that obesity is a modifiable risk factor.⁶⁹ In this context, the causal effect of obesity on nearly all specific cardiovascular outcomes suggested in this study provides an enthusiastic prospect in which lifestyle modification to reduce adiposity can result in the overall reduction of cardiovascular health problems and substantial health-economic burden. ⁷⁰ This study supports the assertion that reducing adiposity through interventional approaches such as bariatric surgery,⁷¹ promotion of educational equality,⁷² lifestyle modifications including healthy diets, 73-78 and increasing physical activities⁷⁷ may better improve one's well-being,⁷⁹ even more so than previously expected, by affecting multiple vascular health outcomes. Our results also support the diet and lifestyle recommendations proposed by the American Heart Association⁸⁰ and European Society of Cardiology⁸¹ and further specify the benefits. Future studies should aim to provide empirical evidence of the effect of lifestyle modifications targeted at reducing adiposity on cardiovascular benefits.

Limitations

This study has several limitations. First, umbrella reviews have intrinsic limitations in that they focus only on existing meta-analyses; therefore, important phenotypes that were not assessed at the metaanalysis level may be overlooked. To minimize the disregard of clinically relevant cardiovascular phenotypes, we independently conducted de novo meta-analyses for certain CVDs (e.g. aortic valve stenosis) that have not been meta-analysed despite a sufficient number of published original studies. Second, when meta-analyses are outdated, they may provide incomplete conclusions with less power, which may directly affect the analyses of subsequent umbrella reviews. As a countermeasure, we updated 19 meta-analyses of observational studies by incorporating recent reports from 35 cohorts to reflect up-to-date conclusions. Third, most genetic studies conducted to date have been conducted of European ancestry⁸²; the MR studies included in this review used genome-wide association study summary statistics from European-ancestry cohorts, such as the UK Biobank, METASTROKE, DIAGRAM, GIANT, and GLGC consortia. This European bias should be resolved in future genetic studies by focusing on diverse ancestries. Fourth, as with previous umbrella reviews of obesity, we did not analyse the effect of underweight on CVD outcomes. 83,84 Although a lower BMI is known to affect CVD outcomes and the association constitutes a J-shaped curve, this analysis was beyond the scope of this investigation because our research question mainly lies in whether and to what extent adiposity causally affects various CVD outcomes. Fifth, some analyses may be susceptible to type I error by repeating statistical significance tests of updated meta-analyses and involving small studies. 85,86 The small studies may draw underpowered conclusions and subsequently feature an increased likelihood of type II error as well.⁸⁵ To consider such small study effects, we examined the composite of sample size, width of confidence interval, and statistical power to judge the 'imprecision' of the GRADE framework and downgraded the evidence level for the detection of such deficiencies. And finally, although we conducted subgroup analyses for potential modifiers such as sex and region, there are likely residual effect modifiers. Furthermore, correlations among outcomes may influence pooled effect sizes. Such residual effect modifiers and correlations among outcomes are subject to future exploration with meta-regressions and multivariate metaanalyses.87,88

Conclusions

Although obesity as a risk factor for various cardiovascular outcomes has been extensively studied for decades, only 26 of the 53 (49%) associations reported here were supported by high-level evidence. While other associations could be genuine, various degrees of uncertainty remain. The results of this study corroborated the causative effect of obesity on nine of 16 CVD-related outcomes, and the remaining four mortality outcomes and three risk factors for incident stroke (all-cause, ischaemic, and haemorrhagic stroke) are at risk of potential reverse causation bias and require further clarification.

Supplementary material

Supplementary material is available at European Heart Journal online.

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Conflict of interest: None declared.

Data availability

The data underlying this article are available in the article and in its online supplementary material.

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