# 1 Title Page

2	Associations of obesity phenotypes with weight change, cardiometabolic
3	benefits, and type 2 diabetes incidence during a lifestyle intervention: results
4	from the PREVIEW study
5	Running title: metabolically healthy obesity and lifestyle intervention
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## 58 ABSTRACT

59	BACKGROUND/OBJECTIVES: Some individuals with overweight/obesity may be
60	relatively metabolically healthy (MHO) and have a lower risk of cardiovascular disease than
61	those with metabolically unhealthy overweight/obesity (MUO). We aimed to compare
62	changes in body weight and cardiometabolic risk factors and type 2 diabetes incidence during
63	a lifestyle intervention between individuals with MHO vs MUO.
64	METHODS: This post-hoc analysis included 1012 participants with MHO and 1153
65	participants with MUO at baseline in the randomized trial PREVIEW. Participants underwent
66	an eight-week low-energy diet phase followed by a 148-week lifestyle-based weight-
67	maintenance intervention. Adjusted linear mixed models and Cox proportional hazards
68	regression models were used.
69	<b>RESULTS:</b> There were no statistically significant differences in weight loss (%) between
69 70	<b>RESULTS:</b> There were no statistically significant differences in weight loss (%) between participants with MHO vs MUO over 156 weeks. At the end of the study, weight loss was
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<ul> <li>69</li> <li>70</li> <li>71</li> <li>72</li> <li>73</li> <li>74</li> <li>75</li> <li>76</li> <li>77</li> </ul>	<b>RESULTS:</b> There were no statistically significant differences in weight loss (%) between participants with MHO vs MUO over 156 weeks. At the end of the study, weight loss was 2.7% (95% CI, 1.7%–3.6%) in participants with MHO and 3.0% (2.1%–4.0%) in those with MUO. After the low-energy diet phase, participants with MHO had smaller decreases in triglyceride (mean difference between MHO vs MUO 0.08 mmol·L <sup>-1</sup> [95% CI, 0.04–0.12]; P<0.001) but similar reductions in fasting glucose and HOMA-IR than those with MUO. However, at the end of weight maintenance, those with MHO had greater reductions in triglyceride (mean difference -0.08 mmol·L <sup>-1</sup> [-0.12–-0.04]; $P<0.001$ ), fasting glucose, 2- hour glucose (difference -0.28 mmol·L <sup>-1</sup> [-0.41–-0.16]; $P<0.001$ ), and HOMA-IR than those

79	HbA <sub>1c</sub> and	greater	decreases	in HDL	cholestero	l after weigh	t loss than	those wit	h MUO.
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- 80 whereas the statistically significant differences disappeared at the end of weight maintenance.
- 81 Participants with MHO had lower 3-year type 2 diabetes incidence than those with MUO
- 82 (adjusted hazard ratio 0.37 [0.20–0.66]; *P*<0.001).
- 83 **CONCLUSIONS:** Individuals with MUO had greater improvements in some
- 84 cardiometabolic risk factors during the low-energy diet phase, but had smaller improvements
- 85 during long-term lifestyle intervention than those with MHO.
- 86
- 87 **Keywords:** metabolic syndrome; cardiovascular disease; low-energy diet; weight loss; type 2
- 88 diabetes

#### **INTRODUCTION** 89

90 The prevalence of overweight and obesity is increasing worldwide (1). Generally, overweight 91 and obesity lead to impaired glucose tolerance, dyslipidemia, and hypertension (2), a cluster 92 of the components of the metabolic syndrome (3). Metabolic syndrome, in turn, increases the 93 risk of developing cardiovascular disease (CVD) and type 2 diabetes (4). Some individuals 94 with overweight or obesity, however, have a normal metabolic profile, which is referred to in 95 the current literature as metabolically healthy overweight/obesity (MHO) (5). Compared with 96 those with metabolically unhealthy overweight/obesity (MUO) or metabolic syndrome, 97 individuals with MHO have been shown to have a lower risk of CVD and type 2 diabetes (4). 98 Previous observational studies have found that individuals with MHO are still at higher 99 CVD and type 2 diabetes risk than those with metabolically healthy normal weight (6, 7). 100 Moreover, those with MHO, without any intervention, were found to develop metabolic 101 abnormalities and converted to MUO during 10-30 year follow-up (8-10). Accordingly, a 102 very recent prospective study suggested that the term 'MHO' may be misleading (7) and a 103 review suggested that obesity treatment was also needed in individuals with MHO for 104 prevention of the natural course of transition to MUO with aging (5). In the present study, we 105 still used MHO to refer to those with overweight or obesity but without metabolic syndrome, 106 for better consistency with previous studies. 107 As the first-line treatment for obesity, lifestyle interventions have been shown to aid 108 weight loss and improve cardiometabolic outcomes in several large-scale, long-term ( $\geq 1$ 109 year) trials (11-15). However, whether long-term lifestyle interventions have similar effects 6

110	in individuals with different metabolic phenotypes (i.e. MHO and MUO) is unclear (5). The
111	concepts of MHO and MUO were not introduced in the abovementioned large-scale studies
112	and only a few small-scale short- or medium-term (<1 year) studies compared the effects of
113	lifestyle or diet interventions on cardiometabolic outcomes between MHO and MUO (9).
114	The PREVIEW study was a multi-center, lifestyle intervention consisting of an 8-week
115	low-energy diet-induced weight loss phase followed by a 148-week lifestyle-based weight-
116	maintenance phase (16). In previous papers, we examined the associations of age, sex, and
117	prediabetes phenotypes with health outcomes (17, 18). The aim of the present analysis was to
118	compare type 2 diabetes incidence and changes in body weight and cardiometabolic risk
119	factors between PREVIEW participants with baseline MHO (or without metabolic syndrome)
120	and MUO (or with metabolic syndrome).

### 121 MATERIALS AND METHODS

### 122 Study design and participants

123 The PREVIEW study (ClinicalTrials.gov, NCT01777893) was a multi-center, two-by-two

124 factorial, randomized controlled trial for diabetes prevention. The detailed study protocol and

125 main findings have previously been published (16, 19). In brief, the PREVIEW study was

126 conducted between June 2013 and March 2018 at eight intervention sites in Denmark, Finland,

127 the Netherlands, the UK, Spain, Bulgaria, Australia, and New Zealand. The aim of the

128 PREVIEW study was to examine the effects of lifestyle interventions (two diets combined

129 with two physical activity programs) on type 2 diabetes incidence. The study was conducted

130	in line with the Declaration of Helsinki and its amendments. The study protocol and
131	procedures were approved by the Human Ethics Committees (Supplementary Table 1).
132	Participants were enrolled from June 2013 to April 2015. Eligible participants were those
133	aged 25–70 years and with overweight or obesity (BMI≥25 kg·m <sup>-2</sup> ) and prediabetes.
134	Prediabetes was identified at the screening visit as fasting plasma glucose of 5.6–6.9 mmol·L <sup>-</sup>
135	$^{1}$ and/or 2-hour plasma glucose of 7.8–11.0 mmol·L <sup>-1</sup> after a 75-g oral glucose tolerance test,
136	according to the American Diabetes Association criteria (20). Hemoglobin A1c (HbA1c) was
137	not used to define prediabetes because it was not widely used when the study protocol was
138	drafted. Those with pre-existing type 1 or 2 diabetes were excluded. All eligible participants
139	provided written informed consent.
140	Interventions
141	The PREVIEW study comprised two phases. Phase 1 was an 8-week low-energy diet phase
142	
1.40	to lose weight and phase 2 was a 148-week weight-maintenance intervention (21). All
143	participants were provided with low-energy diet meal replacement products with 3400 kJ
143 144	to lose weight and phase 2 was a 148-week weight-maintenance intervention (21). All participants were provided with low-energy diet meal replacement products with 3400 kJ (810 kcal) in phase 1, but those who lost≤8% of initial body weight after the low-energy diet
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143 144 145 146	to lose weight and phase 2 was a 148-week weight-maintenance intervention (21). All participants were provided with low-energy diet meal replacement products with 3400 kJ (810 kcal) in phase 1, but those who lost≤8% of initial body weight after the low-energy diet phase were excluded from phase 2. During phase 1, the participants were asked to maintain their usual physical activity habits. In phase 2, participants were randomized into four
143 144 145 146 147	to lose weight and phase 2 was a 148-week weight-maintenance intervention (21). All participants were provided with low-energy diet meal replacement products with 3400 kJ (810 kcal) in phase 1, but those who lost≤8% of initial body weight after the low-energy diet phase were excluded from phase 2. During phase 1, the participants were asked to maintain their usual physical activity habits. In phase 2, participants were randomized into four intervention groups (The randomization was stratified by sex and age group): a high-

149 combined with either high- or moderate-intensity physical activity. The moderate intensity

150	group aimed to achieve 3-5.9 metabolic equivalents of task for 150 min/week; the high
151	intensity group aimed to achieve $\geq 6$ metabolic equivalents of task for 75 min/week. The diets
152	were consumed ad libitum, without an individual target for daily energy intake, but
153	participants were encouraged to self-monitor their portion sizes. To improve diet and physical
154	activity compliance, group counselling visits were performed throughout the study. Diet
155	compliance was evaluated using 4-day food records and physical activity compliance was
156	evaluated using 7-day accelerometry.
157	The primary outcome of the PREVIEW study was type 2 diabetes between the two diets.
158	The sample size calculation was based on the primary outcome. The current analysis is a
159	post-hoc and exploratory analysis. The primary outcomes of the present paper were type 2
160	diabetes incidence and weight change. The secondary outcomes were changes in body
161	composition and cardiometabolic risk factors. The primary and secondary outcomes did not
162	change during the post-hoc analysis. The outcomes were measured at seven clinical
163	investigation days (0, 8, 26, 52, 78, 104, and 156 weeks, respectively) (Supplementary
164	<b>Table 2</b> ). We allowed the following visit windows for data collection: at 8 weeks: -3 to +5
165	days; at 26 weeks: $\pm 1$ week; at 52 weeks: $\pm 2$ weeks; remaining time points: $\pm 4$ weeks.
1.66	
166	Body weight and cardiometabolic risk factors

167 Measurements of body weight, waist circumference, fat mass, fat-free mass, fasting plasma

- 168 glucose, 2-hour plasma glucose, fasting insulin, HbA<sub>1c</sub>, total cholesterol, high-density
- 169 lipoprotein (HDL) cholesterol, fasting triglycerides, systolic blood pressure, and diastolic

170	blood pressure were described previously (16). In brief, blood samples were drawn from the
171	antecubital vein. All measures were determined after a fasting state (>10 hours) and were
172	initially stored at -80°C at each site. Then the samples were transported to the Finnish
173	Institute for Health and Welfare for analysis. We calculated the homeostasis model for
174	assessment of insulin resistance (HOMA-IR) using the following equation: HOMA-
175	IR=fasting insulin in mU·L <sup>-1</sup> ×fasting plasma glucose in mmol·L <sup>-1</sup> /22.5. We also calculated
176	the triacylglycerol-glucose (TyG) index, a new predictor of CVD events, using the formula:
177	TyG= log <sub>e</sub> [triacylglycerols (mg·dL <sup>-1</sup> )×fasting plasma glucose (mg·dL <sup>-1</sup> )/2] (22).
178	Type 2 diabotes assortainment
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179 Type 2 diabetes was diagnosed either by an OGTT (fasting plasma glucose≥7.0 mmol·L<sup>-1</sup>

180 and/or 2-hour plasma glucose $\geq$ 11.1 mmol·L<sup>-1</sup>) conducted at the intervention centers or by a

181 medical doctor, according to the WHO and the American Diabetes Association criteria (20,

182 23).

#### 183 **Definition of MHO and MUO**

184 MHO was defined according to the National Cholesterol Education Program's Adult

- 185 Treatment Panel III report (ATP III) (24), as having BMI≥25 kg·m<sup>-2</sup> and with two or less of
- 186 the following abnormal metabolic risk factors: 1) waist circumference (>102 cm in men
- 187 or >88 cm in women). Waist circumference was used to identify the body weight component
- 188 of the metabolic syndrome, because compared with elevated BMI, abdominal obesity is more
- highly correlated with metabolic syndrome (24). It is suggested that if BMI is over 30 kg $\cdot$ m<sup>-2</sup>,

190	abdominal obesity can be assumed and waist circumference does not need to be measured
191	(25). Nonetheless, as the existence of individuals with overweight (BMI $\geq$ 25 and <30 kg·m <sup>-2</sup> )
192	in the PREVIEW study, in the present analysis waist circumference was still used as one of
193	the abnormal metabolic risk factors; 2) fasting triglycerides (≥1.7 mmol·L <sup>-1</sup> ); 3) HDL
194	cholesterol (<1.03 mmol·L <sup>-1</sup> in men or <1.30 mmol·L <sup>-1</sup> in women); 4) blood pressure
195	(systolic blood pressure ≥130 mmHg or diastolic blood pressure ≥85 mmHg), and 5) fasting
196	plasma glucose (≥6.1 mmol·L <sup>-1</sup> ; the WHO criteria; 1112 PREVIEW participants had fasting
197	plasma glucose<6.1 mmol·L <sup>-1</sup> at baseline). Those with three or more of abnormal clinical
198	measures were identified as having MUO. Those with some CVDs including angina,
199	myocardial infarction, stroke, heart failure, symptomatic peripheral vascular disease, etc and
200	those who had systolic blood pressure>160 mmHg and/or diastolic blood pressure>100
201	mmHg were excluded at the screening visit. Those with missing baseline data for risk factors
202	for metabolic syndrome were excluded from the present analysis.
203	For conversion from MUO to MHO, converters were defined as those who achieved
204	conversion from MUO at baseline to MHO at each time point respectively; and non-
205	converters were defined as those who did not convert from MUO at baseline to MHO at
206	aforementioned time points. In the present analysis, all participants were merged into one
207	intervention group and re-classified according to their baseline obesity phenotype, because 1)
208	no statistically significant interaction of intervention group and obesity phenotypes was
209	observed; and 2) diet and physical activity compliance was lower than expected (16).

#### 210 Statistical analyses

211 Difference in change in outcomes of interest from baseline to 156 weeks between participants 212 with baseline MHO and MUO were examined using linear mixed models. The available-case 213 analysis included all participants, whether they lost >8% of initial weight or not. Missing data 214 were accounted for using expectation maximization algorithm. The linear models were 215 adjusted for fixed covariates including age, sex, ethnicity, baseline BMI, smoking habits, 216 alcohol drinking, and physical activity, changes in physical activity from baseline, baseline 217 values of the outcome being considered, time (categorical), interaction of time and metabolic 218 phenotype, and intervention group and random effects including participant identifier and 219 intervention site. If the interaction was statistically significant, post hoc pairwise comparisons 220 (independent t tests) were conducted at each time point. The justification of selection of 221 covariates is included in **Supplementary Material**. We also conducted several sensitivity 222 analyses: 1) by additionally adjusting for dietary intake (e.g. baseline intakes of carbohydrate, 223 protein, fiber, and fat and time-varying intakes of carbohydrate, protein, fiber, and fat); the 224 definition of time-varying is changes over time; 2) by additionally adjusting for percentage 225 weight change from baseline; 3) by repeating the main analysis in participants who 226 completed the whole study (complete-case analysis); we did not impute missing data as most 227 of the participants had full data; 4) by repeating the main analysis in participants who 228 lost >8% of initial weight and successfully entered the weight maintenance phase; 5) by 229 repeating the main analysis in the highest 75% of MHO according to baseline BMI vs the 230 lowest 75% of MUO according to baseline BMI (Supplementary Table 3). The differences

231	in weight change between converters and non-converters were examined using linear mixed
232	models. The detailed information is described in Supplementary Material.
233	Cumulative incidence of type 2 diabetes was calculated using the Kaplan-Meier method.
234	Because of the visit windows, some participants had a longer (>156 weeks) survival time. In
235	this case, we assumed that their last status was observed at 156 weeks. Diabetes incidence
236	was compared between the groups using a Cox proportional hazards regression model
237	adjusted for age, sex, ethnicity, baseline smoking status, baseline alcohol consumption,
238	baseline BMI, baseline physical activity, changes in physical activity from baseline,
239	intervention arm and intervention site as covariates.
240	The normality of risk factors for metabolic syndrome at each time point and changes in
241	outcomes from baseline to each time point was examined using histograms and p-p plots.
242	Non-normally-distributed variables were log transformed, imputed, and then back
243	transformed. Homogeneity of variance was diagnosed using residual plot. Data analyses were
244	based on IBM SPSS version 28.0 (Chicago, IL, USA) and OriginPro 2020 software
245	(OriginLab, Northampton, MA, USA). The statistical test was two-sided and at the 0.05 level
246	of significance.

#### **RESULTS** 247

#### Participants 248

The present analysis included 2165 participants who started the low-energy diet phase 249

(Supplementary Figure 1). Of these, 1012 were MHO and 1153 were MUO at baseline. 250

251 1822 participants successfully entered the weight maintenance phase. Baseline characteristics

- of all participants are shown in **Table 1** and **Supplementary Table 4**. Participants' dietary
- intake and physical activity during the study are shown in **Supplementary Table 5.**
- 254 Changes in body weight and body composition
- 255 In the available-case analysis, the adjusted models showed that there were no statistically
- significant differences in weight loss (kg and %), or fat mass (kg and %) between participants
- 257 with MHO vs MUO over 156 weeks (Supplementary Figure 2 and Supplementary Figure
- 258 3). After the low-energy diet phase, body weight of participants with MHO reduced by 10.5%
- 259 (9.6%–11.5%) compared with 10.5% (9.5%–11.4%) in those with MUO (ns). At the end of
- the study, participants with MHO retained 2.7% (1.7%–3.6%) weight loss, while MUO
- retained 3.0% (2.1%–4.0%) relative to pre-intervention baseline. Compared with those with
- 262 MUO, participants with MHO had greater overall reduction in waist circumference over 156
- 263 weeks (Supplementary Figure 2) (adjusted mean between-group difference over 156 weeks
- 264 -0.6 cm [95%CI, -1.1--0.1]; *P*=0.011) and a greater regain of fat-free mass (kg) at 156 weeks

265 (difference 0.2 kg [0.02–0.5]; P=0.035) (Supplementary Figure 2). In the complete-case

- analysis, there were no statistically significant differences in weight change (kg and %) over
- 267 156 weeks in participants with MHO vs MUO (Supplementary Figure 4).

#### 268 Change in cardiometabolic risk factors

269 In the available-case analysis, after adjustment for confounding factors, participants with

270 baseline MHO and MUO had a similar decrease in fasting plasma glucose and HOMA-IR

271	after the low-energy diet phase, whereas those with MHO had a greater decrease at 78, 104,
272	and 156 weeks (difference in fasting plasma glucose at 156 weeks -0.17 mmol $\cdot$ L <sup>-1</sup> [95% CI, -
273	0.210.13]; <i>P</i> <0.001; HOMA-IR -0.15 [-0.280.03]; <i>P</i> =0.012; Figure 1). Compared with
274	those with MUO, participants with MHO had a smaller decrease in 2-hour plasma glucose at
275	26 weeks, but a greater decrease at 104 and 156 weeks (difference at 156 weeks -0.28
276	mmol·L <sup>-1</sup> [95% CI, -0.41–-0.16]; $P$ <0.001). Participants with MHO had a smaller decrease in
277	HbA <sub>1c</sub> and diastolic blood pressure and a greater decrease in HDL cholesterol than those with
278	MUO at 8 weeks (difference in HbA <sub>1c</sub> 0.36 mmol·mol <sup>-1</sup> [0.19–0.53]; P<0.001; diastolic
279	blood pressure 0.72 mmHg [95% CI, 0.11–1.33]; <i>P</i> =0.020; HDL -0.04 mmol·L <sup>-1</sup> [-0.05–-
280	0.02]; $P < 0.001$ ), whereas the statistically significant differences disappeared by 156 weeks.
281	Greater overall reduction in low-density lipoprotein (LDL) cholesterol during 156 weeks
282	were observed in MHO vs MUO. Participants with MHO had a smaller decrease in
283	triglycerides and TyG (Supplementary Figure 5) at 8 weeks (difference in triglycerides 0.08
284	mmol·L <sup>-1</sup> [95% CI, 0.04–0.12]; <i>P</i> <0.001; TyG 0.05 mmol·L <sup>-1</sup> [95% CI, 0.02–0.07];
285	P < 0.001), but a greater decrease at 52, 78, 104, and 156 weeks (difference in triglycerides at
286	156 weeks -0.08 mmol·L <sup>-1</sup> [-0.120.04]; <i>P</i> <0.001; TyG -0.05 mmol·L <sup>-1</sup> [95% CI, -0.07
287	0.03]; $P < 0.001$ ). There were no statistically significant differences in changes in systolic
288	blood pressure between participants with MHO and MUO over 156 weeks (Supplementary
289	Figure 5).

- 290 Compared with the primary analyses, the results from the sensitivity analyses were
- similarly robust after adjustment for percentage weight change (Supplementary Figure 6) or

adjustment for intakes of carbohydrate, protein, fiber, and fat. The results were also robust in

- 293 1) completers only (Supplementary Figure 4), 2) participants who entered the weight
- 294 maintenance phase, and 3) those with MHO and higher baseline BMI vs those with MUO but
- lower baseline BMI (Supplementary Figure 7).

#### 296 **Conversion from MUO to MHO**

- With 10.5% (95% CI, 9.6%–11.5%) weight loss, 60% of participants with MUO at baseline
- 298 converted to MHO after the low-energy diet phase, of which only 38% maintained MHO at
- the end of the study, despite 4.3% (3.3%–5.3%) sustained weight loss (**Figure 2**). Compared
- 300 with converters, non-converters had significantly less weight loss (adjusted mean 10.0%
- 301 [95% CI, 9.1%–11.0%]; mean between-group difference -0.5% [-0.9%–-0.1%], *P*=0.005)
- 302 after the low-energy diet phase and comprised a lower proportion of men (26.2% vs 42.6%;
- 303 *P*<0.001), were older (median 56 years [25th and 75th percentiles, 44, 63] vs 55 years [43,
- 304 61]; *P*=0.027), and with higher baseline BMI (36.5 [32.9, 40.8] vs 34.0 [31.1, 38.5];
- 305 P < 0.001) than converters.

#### 306 Type 2 diabetes incidence

- 307 The total number of type 2 diabetes incidence cases was 66 (5 during the low-energy diet
- 308 phase and 61 during the weight maintenance phase; 16 baseline MHO and 50 baseline
- 309 MUO). The 3-year cumulative incidence was 3.2% in those with MHO and 9.2% in those
- 310 with MUO (Figure 3). The adjusted hazard ratio was 0.37 (95% CI, 0.20–0.66) for
- 311 individuals with baseline MHO vs MUO (*P*<0.001).

## **DISCUSSION**

313	In the present study, we found that after adjustment for confounding factors, compared with
314	those with baseline MHO, individuals with baseline MUO had greater improvements in
315	cardiometabolic risk factors during the low-energy diet phase, but had smaller improvements
316	during the 3-year lifestyle intervention, despite similar weight change between the two
317	obesity phenotypes throughout the study. Participants with MUO had higher 3-year
318	cumulative type 2 diabetes incidence than those with MHO.
319	Similar to our findings, previous short-term studies have shown no statistically significant
320	differences in weight change between individuals with baseline MHO and MUO during an
321	energy-restricted diet- or lifestyle weight-loss interventions (26-32). The response to energy-
322	restricted diets in weight change between individuals with baseline MHO and MUO has been
323	mostly investigated in women (i.e. premenopausal women only, postmenopausal women
324	only, or both) (26-28). Also, the aforementioned studies did not find different changes in
325	waist circumference, fat mass, or fat-free mass between those with MHO and MUO during
326	the interventions (28-30, 32). Differences in changes in waist circumference and fat-free mass
327	were detectable in the present study, but the effect sizes were very small (differences between
328	MHO vs MUO<1% baseline values of weight-related outcomes). Taking all the available
329	evidence together, energy-restricted diets or lifestyle interventions may not induce clinically
330	significant differences in body weight or body composition changes between individuals with
331	MHO vs MUO.

332	In terms of improvements in cardiometabolic risk factors, previous studies have
333	demonstrated that individuals with MHO may benefit to the same extent or less from short-
334	term (3 to 9 months) diet- or lifestyle-based weight-loss interventions (26-32). We are the
335	first to explore longer-term effects of lifestyle-based weight maintenance in participants with
336	MHO and MUO. We found clinically significant changes in cardiometabolic risk factors
337	between participants with MHO vs MUO. Specifically, participants with MUO benefited
338	more or similarly in almost all the cardiometabolic risk factors during the low-energy diet,
339	especially in triglycerides and HDL cholesterol (differences between MHO vs MUO: 3%-7%
340	baseline values), but the greater benefits in cardiometabolic risk factors in those with MUO
341	disappeared during the first year of the weight-maintenance intervention. Moreover, in the
342	long-term, participants with MHO had greater improvements in cardiometabolic risk factors,
343	especially in 2-hour plasma glucose, HOMA-IR, and triglycerides (differences between MHO
344	vs MUO: 4%–7% baseline values), than those with MUO. Our findings still remained robust
345	in multiple sensitivity analyses.
346	In previous cohort studies, without interventions, individuals with baseline MHO are less
347	likely to develop type 2 diabetes than those with baseline MUO, although those with MHO
348	are at increased type 2 diabetes risk than healthy individuals with normal body weight (5, 7,
349	33). Our study is the first to compare type 2 diabetes incidence after a long-term lifestyle
350	intervention and we found that participants with MHO still had lower type 2 diabetes risk.
351	For individuals with MUO, a review suggested that 10% weight loss is necessary to move

352 from MUO to MHO (34). However, in the present study some participants with MUO (four

353	in ten), with 10% weight loss after the low-energy diet, failed to convert to MHO. Compared
354	with non-converters, converters had greater weight loss (10.5%), a higher proportion of men,
355	and lower age and baseline BMI, although the difference in weight loss between converters
356	and non-converters was small. Regarding individuals with MHO, conversion from MHO to
357	MUO with aging has been found by several large observational studies (8-10). The
358	conversion from MHO to MUO based on the PREVIEW database will be investigated in the
359	future.
360	Our findings suggest that risk stratification may be important and individualized type 2
361	diabetes or CVD prevention may be needed. For long-term type 2 diabetes or CVD
362	prevention, traditional lifestyle interventions failed to show more favorable or at least similar
363	effects in individuals with MUO compared with those with MHO. Individuals with MUO
364	(with metabolic syndrome) might need more intensive lifestyle interventions (e.g. high-
365	intensity physical activity and energy-restricted diets) or even pharmacologic
366	therapy/bariatric surgery than those with MHO. Also, our findings support the Edmonton
367	Obesity Staging System and the obesity classification based on metabolic status (35).
368	Individuals with obesity or obesity might need to be classified. For obesity-related chronic
369	disease (e.g. type 2 diabetes), intensive obesity treatments (e.g. all psychological
370	interventions and pharmacological and surgical treatment options ) are needed (35).
371	Notably, currently there is no universally accepted definition of MHO, although the
372	definition of metabolic syndrome is used in most previous studies. The cut-off points of each
373	metabolic syndrome components are not always the same in different studies (e.g. a cut-off 19

374	point of 5.6 or 6.1 or 7.0 mmol·L <sup>-1</sup> for fasting plasma glucose) (5, 36). The diversity of the
375	definition may cause conflicting findings. The present analysis used the harmonized MHO
376	definition proposed by the BioShare-EU project (37) and used 6.1 mmol·L <sup>-1</sup> as the cut-off
377	point of fasting plasma glucose. This cut-off point enabled us to have similar numbers of
378	participants in each metabolic subgroup and have a large enough sample size to conduct a
379	complete-case analysis.
380	The present analysis is exploratory and the findings need to be interpreted with caution.
381	The higher-than-expected attrition rate at the end of the study should be regarded as a
382	limitation. A high percentage of missing data at the end of the study may cause selection bias.
383	To minimize the bias, we imputed the missing data and conducted a complete-case analysis.
384	Furthermore, the sample was mostly Caucasian (87%), which may limit the generalizability
385	of the present results for other ethnicities. Finally, in the present analysis participants with
386	MUO had significant lower baseline BMI than those with MHO. To minimize this limitation,
387	we included baseline BMI as a confounder in the statistical models. We also did a sensitivity
388	analysis based on MHO (with higher baseline BMI) and MUO (with lower baseline BMI)
389	subgroups and the results were similar. In addition, given that the magnitude of changes in
390	outcomes from baseline may be correlated to baseline values, we adjusted for baseline
391	outcomes of interest.
392	In conclusion, individuals with baseline MUO had greater improvements in
393	cardiometabolic risk factors during the low-energy diet phase, but had smaller improvements
394	during a 3-year lifestyle intervention than those with baseline MHO, despite similar weight

395 change between the two obesity phenotypes throughout the study. Risk stratification

- 396 according to obesity phenotypes might be important and individualized CVD prevention in
- individuals with overweight or obesity might be needed.

398

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- 407 Ruixin Zhu: Conceptualization, Formal analysis, Investigation, Writing original draft,
- 408 Writing review & editing. Anne Raben: Funding acquisition; Conceptualization,
- 409 Supervision; Investigation, Writing review & editing. Maija Huttunen-Lenz, Gareth
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439	ETHICS STATEMENT
440	The study was approved by Research Ethics Committees of the Capital Region, Coordinating
441	Ethical Committee of HUS (Helsinki and Uusimaa Hospital District), Medical Ethics
442	Committee of the Maastricht University Medical Centre, UK National Research Ethics

books about diet and diabetes. She is also a member of the Scientific Advisory Board of the

- 443 Service (NRES) and East Midlands (Leicester) Ethics Committee, Research Ethics
- 444 Committee of the University of Navarra, Commission on Ethics in Scientific Research with
- the Medical University-Sofia (KENIMUS), The University of Sydney, Human Research
- 446 Ethics Committee (HREC), and Health and Disability Ethics Committees (HDEC).

## 447 DATA AVAILABILITY STATEMENT

- 448 The study protocol and the datasets analysed during the current study are available from the
- 449 corresponding author on reasonable request.

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562

### 564 **Table 1.** Participant characteristics at baseline

	All participants	МНО	MUO
	(n=2165)	(n=1012)	(n=1153)
Socio-demographics			
Age range, years	25 to 70	25 to 70	25 to 70
Age, years	55 (43, 61)	51 (41, 60)	55 (44, 62)
Sex			
Women	1469 (67.9%)	731 (72.2%)	738 (64.0%)
Men	696 (32.1%)	281 (27.8%)	415 (36.0%)
Anthropometry and body			
composition			
Body weight, kg	96.8 (84.7, 110.8)	93.0 (81.8, 105.8)	100.5 (88.2, 114.4)
Height, m	1.67 (1.61, 1.74)	1.67 (1.61, 1.73)	1.68 (1.62, 1.75)
BMI, kg $\cdot$ m <sup>-2</sup>	33.9 (30.7, 38.5)	32.9 (29.8, 37.4)	35.0 (31.7, 39.2)
Waist circumference, cm	110.4 (14.7)	106.4 (14.7)	114.0 (13.7)
Fat mass, kg	40.9 (33.5, 50.4)	39.0 (31.9, 48.1)	42.5 (34.8, 51.5)
Fat-free mass, kg	54.0 (47.7, 64.1)	51.9 (46.6, 61.2)	56.3 (48.7, 66.4)
Glucose metabolism			
Fasting plasma glucose, mmol·L <sup>-1</sup>	6.2 (0.7)	5.8 (0.6)	6.4 (0.7)
2-hour plasma glucose, mmol·L <sup>-1</sup>	7.7 (2.2)	7.0 (1.9)	8.2 (2.3)
Fasting insulin, mU·L <sup>-1</sup>	11.5 (8.4, 16.4)	9.9 (7.1, 13.9)	13.3 (9.8, 18.7)
HOMA-IR	3.2 (2.2, 4.6)	2.6 (1.8, 3.7)	3.8 (2.7, 5.4)
HbA <sub>1c</sub> , %	5.5 (0.4)	5.4 (0.3)	5.6 (0.4)
HbA <sub>1c</sub> , mmol·mol <sup>-1</sup>	36.7 (4.0)	35.6 (3.4)	37.7 (4.2)
Lipid metabolism			
Fasting triglycerides, mmol·L <sup>-1</sup>	1.3 (1.0, 1.8)	1.1 (0.9, 1.4)	1.7 (1.2, 2.1)
Triglyceride-glucose index	9.5 (0.5)	9.2 (0.4)	9.7 (0.4)
Total cholesterol, mmol·L <sup>-1</sup>	5.2 (1.0)	5.1 (1.0)	5.3 (1.0)
HDL cholesterol, mmol·L <sup>-1</sup>	1.2 (1.1, 1.4)	1.4 (1.2, 1.5)	1.2 (1.0, 1.3)
LDL cholesterol, mmol·L <sup>-1</sup>	3.2 (2.6, 3.8)	3.2 (2.6, 3.7)	3.2 (2.7, 3.8)
Blood pressure			
Systolic blood pressure, mmHg	129 (16)	123 (14)	135 (15)
Diastolic blood pressure, mmHg	79 (71, 85)	75 (68, 81)	82 (75, 89)

565 Data are mean (SD), median (25th, 75th percentiles), or n (%). HbA<sub>1c</sub>, haemoglobin A<sub>1c</sub>; HDL cholesterol, high-

566 density lipoprotein cholesterol; HOMA-IR, homeostatic model assessment of insulin resistance; LDL

567 cholesterol, low-density lipoprotein cholesterol; MHO, metabolically healthy overweight/obesity; MUO,

568 metabolically unhealthy overweight/obesity.

570	Figure 1. Changes in cardiometabolic risk factors (n=2165). Values are estimated marginal mean (95% CI) in
571	changes in fasting plasma glucose (A), 2-hour plasma glucose (B), HOMA-IR (C), HbA1c (D), diastolic blood
572	pressure (D), triglycerides (F), HDL cholesterol (G), and LDL cholesterol (H) from baseline. Analyses were
573	performed using a linear mixed model adjusted for age, sex, ethnicity, baseline BMI, smoking, alcohol drinking,
574	and physical activity, time-varying change in physical activity from baseline, baseline outcomes, intervention
575	group, time by metabolic phenotype interaction, and time as fixed covariates and participant identifier and
576	intervention site as random effects. *Statistically significantly different, P<0.05. HbA <sub>1c</sub> , haemoglobin A <sub>1c</sub> ; HDL
577	cholesterol, high-density lipoprotein cholesterol; HOMA-IR, homeostatic model assessment of insulin
578	resistance; LDL cholesterol, low-density lipoprotein cholesterol; MHO, baseline metabolically healthy
579	overweight/obesity; MUO, baseline metabolically unhealthy overweight/obesity.
580	Figure 2. Conversion from metabolically unhealthy to healthy overweight/obesity (n=1153). Values are
581	estimated marginal mean (95% CI) in percentage weight change from baseline and the proportion of converters
582	to non-converters in participants with MUO at baseline. Analyses were performed using a linear mixed model
583	adjusted for age, sex, ethnicity, baseline BMI, smoking, alcohol drinking, and physical activity, time-varying
584	change in physical activity from baseline, baseline outcomes, intervention group, time by metabolic phenotype
585	interaction, and time as fixed covariates and participant identifier and intervention site as random effects. *
586	Statistically significantly different, P<0.05. MHO, baseline metabolically healthy overweight/obesity; MUO,
587	baseline metabolically unhealthy overweight/obesity.
588	Figure 3. Cumulative incidence of type 2 diabetes (n=2165). Values are cumulative incidence of diabetes in

589 participants with MUO vs MHO at each time point. Cumulative incidence was calculated using the Kaplan-

- 590 Meier method, without adjustment. The incidence of diabetes was compared between participants with MUO vs
- 591 MHO using a Cox proportional hazards regression model adjusted for age, sex, ethnicity, baseline smoking
- 592 status, baseline alcohol consumption, baseline BMI, baseline physical activity, changes in physical activity from
- 593 baseline, intervention arm and intervention site as covariates. MHO, baseline metabolically healthy
- 594 overweight/obesity; MUO, baseline metabolically unhealthy overweight/obesity.
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